### **Bioinformatic challenges**

# Whole molecule sequencing methods and their applications

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The double helix is indeed a remarkable molecule. Modern man is perhaps 50,000 years old, civilization has existed for scarcely 10,000 years and the United States for only just over 200 years; but DNA and RNA have been around for at least several billion years. All that time the double helix has been there, and active, and yet we are the first creatures on Earth to become aware of its existence.

Francis Crick (1916–2004)



### **DNA story**



### 1870 Friedrich Miescher discovers DNA

### 1944

Oswald Avery proves that DNA is a genetic material







1. Remove the lipids and carbohydrates from a solution of heat-killed S cells. Proteins, RNA, and



1953

James Watson and Francis Crick discover DNA structure







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## Sequencing: beginnings

### 1964

Robert W. Holley determines nucleotide sequences (77 nt) of the yeast Alanine tRNA J. Biol. Chem. 240: 2122-2128





1968

Ray Wu and A. Dale Kaiser sequenced 12 bases (!) of  $\lambda$  phage's 5' cohesive ends of its DNA, using radioactively labeled nucleotides and polyacrylamide gel electrophoresis J. Mol. Biol. 35: 523-537





## Sequencing: 1st generation sequencing

### 1977

Allan Maxam and Walter Gilbert develop DNA sequencing method by chemical degradation J. Biol. Chem. 240: 2122-2128





1977

Fred Sanger develops 2',3'-dideoxy chain termination method J. Mol. Biol. 35: 523-537

























## Sequencing: maturation

- 1983 Marvin Caruthers developed a method to construct fragments of DNA of predetermined sequence from five to about 75 base pairs long. He and Leroy Hood invented instruments that could make such fragments automatically.
- 1983 Kary Mullis invented the polymerase chain reaction (PCR) technique
- 1987 ABI 370; first fully automated sequencing machine

- 1995 Craig Venter uses whole-genome shotgun sequencing technique to determine complete genome of bacterium Haemophilus influenzae
  - 2005 introduction of GS20 sequencing machine (454 Life Sciences); first in the line of "Next Generation Sequencing"
- 2010 PacBio introduced first single molecule, long reads instrument marking Third Generation Sequencing.

### Sequencing: maturation



Imaging system



### Sequencing: maturation



## **Next Generation Sequencing**

- Massive parallelization of the sequencing process
- Relatively short reads
- Different approaches from improving Sanger's technique to direct "observation" of DNA through a microscope





### Sequencing: 3rd generation sequencing

### 2010 PacBio - SMRT technology



Eid at al. (2009) Science 323: 133-138

### 2014 Oxford Nanopore Technologies MinION



Kasianowicz et al. (1996) PNAS 93: 3770-13773







Single Molecule, Real-Time (SMRT) Sequencing <u>https://www.youtube.com/watch?v=\_ID8JyAbwEo</u>



## PacBio - key technology

SMRTbell templates enable repeated sequencing of circular template with real-time base incorporation

Single-Molecule Resolution

A single molecule of DNA is immobilized in each ZMW



are measured in real time















SMRT Cells contain millions of zero-mode waveguides (ZMWs)

Use PacBio Sequel Systems to sequence genomes, transcriptomes, and epigenomes

Prepare sequencing reaction





## Sequencing using nanopores

Nanopores as polymer sensors.

The idea emerged in early 1990s.

Fundamental work done by David Deamer and Daniel Branton in collaboration with John Kasianowicz. (PNAS 1996 146:13770-13773)

Biologicaly relevant experiments – since 2010.



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https://nanoporetech.com/how-it-works

## Nanopore basics

- to create pores in membranes. Pore-forming proteins are common in nature.
- For example, the protein  $\alpha$ -hemolysin and similar protein pores are found naturally in cell
- including DNA. The pore is highly stable.
- Membrane is synthetic
- Non-destructive motor protein
- Read speed: about 400 bases per second

### • Oxford Nanopore's first generation of technology uses bespoke, proprietary pore-forming proteins

membranes, where they act as channels for ions or molecules to be transported in and out of cells.

•  $\alpha$ -hemolysin is a heptameric protein pore with an inner diameter of 1 nm, about 100,000 times smaller than that of a human hair. This diameter is the same scale as many single molecules,







## **Nanopore basics - basecalling**

- Raw electrical signal has to be translated to nucleotide sequence
- Originally, Hidden Markov Model based algorithms were used but performance was not so good; about 60-70% accuracy
- All recent basecallers are based on neutral networks.
- Electric signal produced by four nucleotides occupying a pore is processed at a time.
- Current accuracy of a single read is about 95% with consensus sequence produced at the accuracy level of 99.9%



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### **ONT devices**

		Number of channels per flow cell	Yield per flow cell	Yield per device	Maximum run time	Application
<image/>	Flongle	126	2 Gb	2 Gb	16 hr	Amplicons, panels/targeted sequencing, quality testing, small sequencing tests
	MinION	512	50 Gb	50 Gb	48 hr	Whole genomes/exomes, metagenomics, target sequencing, whole transcriptome (cDNA), small transcriptomes (direct RNA), multiplexing for smaller samples
	GridION	512	50 Gb	250 Gb	48 hr	Larger genomes or projects, whole transcriptom (direct RNA or cDNA), large numbers of sample
<image/>	PromethION 24	3000	220 Gb	5.2 Tb	72 hr	Very large genomes or projects, population-scal human, whole transcriptomes, very large numbe of samples
	PromethION 48	3000	220 Gb	10.5 Tb	72 hr	



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## Pricing

	PacBio	Nanopore
Initial investment	\$495,000 (Sequel II)	\$1,000 - \$327k
Single run	\$1,300	\$900
De novo small genome	\$1,300	\$900
De novo large genome	\$2,600	\$900 (?)
Whole transcriptome	\$1,300	\$900
Metagenomics (full-length 16S)	\$15 (multiplexing up to 96 samples)	?





## The Old Sequencing Paradigm

### Sequence reads are long OR accurate











### NGS vs 3rd Generation Sequencing

99.9%

### Technology

### **Short Reads**

### Long Reads

### **Read Length Read Accuracy Genome Characterization**

300 bp

>20 kb

### single nucleotide variants, indels

### 89.0% structural variants, assembly





### NGS vs 3rd Generation Sequencing

Technology

**Short Reads** 

Long Reads **PacBio CCS**  300 bp >20 kb

**Read Length** 

10-20 kb

- **Read Accuracy** Genome Characterization single nucleotide variants, 99.9% indels 89.0% structural variants, assembly 99.8%
  - comprehensive





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### **Benefits of Long Reads**

- Highly accurate *de novo* genome assembly
- Phase variants into haplotypes
- More accurate variant detection
- Sequencing full-length transcripts
- Exploring metagenomes in high resolution
- Epigenetics



### Genome assembly





Genome size (bp)

### **Challenges of Genome Assembly**

- Size and complexity
  - human genome over 3 billion base pair
  - plants often have larger genomes
- Extreme repeat content
  - maize over 60%
  - wheat over 80%

10 11

- Each project is unique
  - ranges in size, ploidy, heterozygosity
  - custom strategy is required

### **Draft Versus Complete Genome**

### Short reads



### **Draft Genome**

Missing sequencing leads to missed genes and limits biological interpretation

### Long reads





### **Complete Genome**

A comprehensive structural, functional and organizational picture of the genome













### Unique region















Unique region

Assembly



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## Haplotyping (phasing)







## Haplotyping (phasing)








### Variant detection

Single nucleotide variant

Deletion

Insertion

Tandem duplication

Translocation

Inversion

Copy number variant



### Type of variants

- AAGTGTCATTACGTAG Individual 2
- AAGTGGCATTACGTAG Individual 1
- AAGTGCATTACGTAG Individual 2
- AAGTGCATTACGTAG Individual 1
- AAGTGGCATTACGTAG Individual 2
- AAGTGGCATTACGTAG Individual 1
- AAGTGGCTGCATTACGTAG Individual 2
  - AAGTGCATTACGTAG Individual 1
  - AAGTTTACGTGCAAG Individual 2
  - AAGTGGCATTACGTAG Individual 1
  - AAGTTGCCTTACGTAG Individual 2

AAGT GCA GCA TTACGTAG Individual 1 AAGT GCA GCA GCA GCA TTACGTAG Individual 2 1 2 3 4



### Genetic variation occurs at small and large scale









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# **Isoforms (alternative splicing)** A gene consisting of five exons



Additional analysis required to recover all isoforms



Few reads spanning junctions

Full length transcripts recover all isoforms





# After sequencing is done

- Basecalling
- Mapping
- Sequence Assembly
- Variant detection
- and more

# **Software For Long Reads**



# **Base callers for nanopore sequencing**

ΤοοΙ	Read qscore#	Consensus qscore#
Albacore	9.2	21.9
BasecRAWller	N/A	N/A
Chiron	7.7	21.4
DeepNano	N/A	N/A
Flappie	9.6	22.0
Guppy	9.7	23.0
Metrichor	N/A	N/A
Nanocall	N/A	N/A
Scrappie	9.3	22.4





### **Availability**

- Only to ONT customers
- https://basecrawller.lbl.gov/ (seems to be down)
- https://github.com/haotianteng/Chiron
- https://bitbucket.org/vboza/deepnano/src/master/
- https://github.com/nanoporetech/flappie
- Only to ONT customers
- Only to ONT customers
- https://github.com/mateidavid/nanocall
- https://github.com/nanoporetech/scrappie

Makałowski and Shabardina (2020) Bioinformatics of nanopore sequencing. J. Hum. Genet. 65:61-67.



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## Aligners

ΤοοΙ	Algorithm	Availability
BWA	Burrows-Wheeler Aligner's Smith-Waterman Alignment	http://bio-bwa.sourceforge.net
GraphMap	Gapped spaced seeds	https://github.com/isovic/graphmap
Kart	Divide and conquer	https://github.com/hsinnan75/Kart
LAMSA	Sparse dynamic programming (SDP)-based split alignment	https://github.com/hitbc/LAMSA
LAST	Adaptive seeds approach	http://last.cbrc.jp/
Minimap2	Hash table approach	https://github.com/lh3/minimap
NGMLR	k-mer search followed by a banded Smith- Waterman alignment algorithm	https://github.com/philres/ngmlr
winnowmap	weighted-minimizer sampling algorithm	https://github.com/marbl/winnowmap

Makałowski and Shabardina (2020) Bioinformatics of nanopore sequencing. J. Hum. Genet. 65:61-67.





## **Assemblers (selected)**

ΤοοΙ	Description	Availability
Canu	A hierarchical assembly pipeline based on Celara Assembler	https://github.com/marbl/canu
Flye	De novo assembler for single molecule sequencing reads	https://github.com/fenderglass/Flye
MECAT	An ultra-fast mapping, error correction and de novo assembly tool for long reads	https://github.com/xiaochuanle/MEC
Medaka	A tool to create a consensus sequence of nanopore sequencing data using neural networks	https://nanoporetech.github.io/meda index.html
NanoPipe	A pipeline that includes a consensus sequence calculation based on LAST alignment to a reference sequence	http://bioinformatics.uni-muenster.de tools/nanopipe2/index.hbi
Nanopolish	Software package for signal-level analysis of Oxford Nanopore sequencing data, including consensus sequence calculation	https://github.com/jts/nanopolish
Shasta	Using a run-length representation of the read sequence and a representation of the read sequence based on <i>markers</i> , a fixed subset of short k-mers ( $k \approx 10$ ).	<u>https://github.com/chanzuckerberg/</u> <u>shasta</u>



Makałowski and Shabardina (2020) Bioinformatics of nanopore sequencing. J. Hum. Genet. 65:61-67.





# Variant calling

ΤοοΙ	Description	Availability
Clair	Deep neural network based variant caller	https://github.com/HKU-BAL/Clair
HapCUT2	It is a maximum-likelihood-based tool for assembling haplotypes.	https://github.com/vibansal/HapCUT2
IDP-ASE	Haplotyping and quantification of allele-specific expression	http://augroup.org/IDP-ASE/IDP-ASE
Medaka	An experimental pipeline to call SNPs	https://nanoporetech.github.io/medaka/ index.html
NanoPipe	A pipeline that includes a consensus sequence calculation based on LAST alignment to a reference sequence	http://bioinformatics.uni-muenster.de/tools/ nanopipe2/index.hbi https://github.com/IOB-Muenster/nanopipe2
Nanopolish	Software package for signal-level analysis of Oxford Nanopore sequencing data, including SNP and indel calling	https://github.com/jts/nanopolish
PBHoney	An implementation of variant-identification designed for long reads	https://sourceforge.net/projects/pb-jelly/
Sniffles	Sniffles is a structural variation (over 10 bp) caller using third generation sequencing	https://github.com/fritzsedlazeck/Sniffles
WhatsHap	It is a software for phasing genomic variants	https://whatshap.readthedocs.io/en/latest/





# NanoPipe

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### http://bioinformatics.uni-muenster.de/tools/nanopipe2/index.hbi?lang=en

### f Bioinformatics Münster



icing devices. As a result, it provides alignments to any target of interest, alignment statistics and information about polym

ent team is open to suggestions and requests for implementing new targets.

a, 💿 Norbert Grundmann, 💿 Felix Manske, 💿 Tabea Kischka and 💿 Wojtek Makalowski

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### About

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Aug-20: 156628333047847 EGFR\_1D.fa

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Insertion Extension Cost (-B)	?							
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Maximum Score Drop (-x)	?							
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Coverage threshold	?	0.3						

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Stay updated via RSS>2020-07-29ICTV updated to MSL35version May 1changes2020-04-23Improved pathogen graph for viruses2020-03-15Preprint is available>2020-03-13	This metagenomics pipeline analyzes reads from both targeted and whole genome Additionally, you will receive a summary covering all organisms in your sample. Ou feature, pathogenic bacteria or archae The Metagenomics developm Presented by ③
Desktop version release » 2020-03-13 Updated testcases	2019-11-18 10:35

### of Bioinformatics Münster

### Welcome to



e sequencing. It is suitable for long and short-read sequencing technologies. Each read will be reported with its respective taxonomy. Our databases cover organisms throughout the tree of life: Bacteria, archaea, fungi and further selected eukaryotes. As an additional aea are predicted in your sample. All results are visualized in intuitive interactive graphs.

oment team is open to suggestions and requests for implementing new targets.

⊙ Felix Manske, ⊙ Norbert Grundmann and ⊙ Wojtek Makalowski

Logo created by Maciej Makalowski.

### http://bioinformatics.uni-muenster.de/tools/metag/index.hbi?lang=en





### MetaG

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# **Cool Projects**



ALLER BRANCE



### **Bringing Sequencing to the Masses**

### • Sequencing literally anywhere



Astronaut Dr. Kate Rubins on the ISS







Dr. Jacqueline Goordial, University of Guelph, Canada



### **Bringing Sequencing to the Masses**

### • Sequencing in rural areas of underdeveloped countries, helping to fight infectious diseases.



### MinION workshop in Manado, Indonesia

Yamagishi J, Runtuwene LR, Hayashida K, Mongan AE, Thi LAN, Thuy LN, Nhat CN, Limkittikul K, Sirivichayakul C, Sathirapongsasuti N, Frith M, Makalowski W, Suzuki Y (2017) Serotyping dengue virus with isothermal amplification and a portable sequencer. Scientific Reports 7: 3510

Runtuwene LR, Tuda JSB, Mongan AE, Makalowski W, et al. Y. (2018) Nanopore sequencing of drug-resistance-associated genes in malaria parasites, Plasmodium falciparum. Sci Rep. 8:8286.

### and Bangkok



### **Cancer Genomics**

### Long-read sequencing for non-small-cell lung cancer genomes

Yoshitaka Sakamoto,<sup>1</sup> Liu Xu,<sup>1</sup> Masahide Seki,<sup>1</sup> Toshiyuki T. Yokoyama,<sup>1</sup> Masahiro Kasahara,<sup>1</sup> Yukie Kashima,<sup>2,3</sup> Akihiro Ohashi,<sup>3</sup> Yoko Shimada,<sup>4</sup> Noriko Motoi,<sup>5</sup> Katsuya Tsuchihara,<sup>2</sup> Susumu S. Kobayashi,<sup>3</sup> Takashi Kohno,<sup>4</sup> Yuichi Shiraishi,<sup>6</sup> Ayako Suzuki,<sup>1,2</sup> and Yutaka Suzuki<sup>1</sup>

<sup>1</sup>Department of Computational Biology and Medical Sciences, Graduate School of Frontier Sciences, The University of Tokyo, Chiba

Here, we report the application of a long-read sequencer, PromethION, for analyzing human cancer genomes. We first conducted whole-genome sequencing on lung cancer cell lines. We found that it is possible to genotype known cancerous mutations, such as point mutations. We also found that long-read sequencing is particularly useful for precisely identifying and characterizing structural aberrations, such as large deletions, gene fusions, and other chromosomal rearrangements. In addition, we identified several medium-sized structural aberrations consisting of complex combinations of local duplications, inversions, and microdeletions. These complex mutations occurred even in key cancer-related genes, such as STK11, NF1, SMARCA4, and PTEN. The biological relevance of those mutations was further revealed by epigenome, transcriptome, and protein analyses of the affected signaling pathways. Such structural aberrations were also found in clinical lung adenocarcinoma specimens. Those structural aberrations were unlikely to be reliably detected by conventional short-read sequencing. Therefore, long-read sequencing may contribute to understanding the molecular etiology of patients for whom causative cancerous mutations remain unknown and therapeutic strategies are elusive.









### **Cancer Genomics**







Sakamoto et al. (2020) Long-read sequencing for non-small-cell lung cancer genomes. Genome Res. 30:1243-1257



### в ..... 1.00 1.44 1.00-1 9 reads (3 kb - 70 kb) LC2/ad 941 kb deletion 15 reads (5 kb - 79 kb) A549 296 kb deletion 8 reads (8 kb - 71 kb) PC-14 ..... 3,438 kb deletion ----\*\*\*\*\*\* BI BI---\_\_\_\_ MIR31HG CDKN2A DMRTA1

MTAP





### The Telomere-to Telomere (T2T) consortium

- Community-based effort to generate the first complete assembly of a human genome.
- arrays, and satellite arrays that harbor unexplored variation of unknown consequence.
- 44 Gb of sequence in reads 100 kb+ and a maximum read length exceeding 1 Mb.
- Using this assembly as a basis, they manually finished the X chromosome. The few unresolved to anchor overlapping ultra-long reads.

Miga KH, Koren S, et al. Telomere-to-telomere assembly of a complete human X chromosome. Nature, 2020. Logsdon GA, et al. The structure, function, and evolution of a complete human chromosome 8. bioRxiv, 2020.

• The consortium aims to finish remaining unresolved regions and generate the first truly complete assembly of a human genome. These regions include segmental duplications, ribosomal rRNA gene

• Data: 50X coverage of ultra-long Oxford Nanopore sequencing for the CHM13hTERT cell line, including

• This coverage of ultra-long reads enabled the resolution of most repeats in the genome, including large fractions of the centromeric satellite arrays and short arms of the acrocentrics. A de novo assembly combining this nanopore data with 70X of existing PacBio data achieved an NG50 contig size of 75 Mb (compared to 56 Mb for GRCh38), with some chromosomes broken only at the centromere.

segmental duplications were assembled using ultra-long reads spanning the individual copies, and the ~2.8 Mbp X centromere was assembled by identifying unique variants within the array and using these

### Conclusions

- Long reads are not necessarily "noisy" any more
- Sequencing is getting not only affordable but also easy to use almost at any place
- Computational analyses lag behind sequencing technology development
- "Sequencing for the masses" is the present not the future!









