#### CMSC 858D :

#### Details of Sequencing Technologies: short & long-read sequencing

NOTE: Illumina sequence slides are taken from <a href="http://www.slideshare.net/USDBioinformatics/illumina-sequencing">http://www.slideshare.net/USDBioinformatics/illumina-sequencing</a>

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# **Illumina Diagram**

1. PREPARE GENOMIC DNA SAMPLE

#### 2. ATTACH DNA TO SURFACE

7. DETERMINE FIRST BASE

8. IMAGE FIRST BASE





Second chemistry cycle: to initiate the next sequencing cycle, add all four labeled reversible terminators and enzyme to the flow cell.

12. ALIGN DATA



Align data, compare to a reference, and identify sequence differences.





4. FRAGMENTS BECOME DOUBLE STRANDED



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

5. DENATURE THE DOUBLE-STRANDED MOLECULES

Attached



3. BRIDGE AMPLIFICATION

initiate solid-phase bridge amplification.



10. IMAGE SECOND CHEMISTRY CYCLE



11. SEQUENCE READS OVER MULTIPLE CHEMISTRY CYCLES







The enzyme incorporates nucleotides to build double-stranded bridges on the solidphase substrate.

Denaturation leaves single-stranded templates anchored to the substrate.

Attached

Several million dense dusters of doublestranded DNA are generated in each channel of the flow cell.

After laser excitation, collect the image data as before. Record the identity of the second base for each duster.

Repeat cycles of sequencing to determine the sequence of bases in a given fragment a single base at time.

Clusters

Image retrieved from http://res.illumina.com/documents/products/techspotlights/techspotlight\_sequencing.pdf

6. COMPLETE AMPLIFICATION

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6. COMPLETE AMPLIFICATION

1. PREPARE GENOMIC DNA SAMPLE



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

Image retrieved from <u>http://res.illumina.com/</u> <u>documents/products/techspotlights/</u> <u>techspotlight\_sequencing.pdf</u>

## Prepare Genomic DNA Sample

- Fragment DNA of interest into smaller strands that are able to be sequenced
  - Sonication
  - Nebulization
  - Enzyme digestion
- Ligate Adapters
- Denature dsDNA into ssDNA by heating to 95° C

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# Attach DNA to Surface

- ssDNA is then bound to inside surface of flow cell channels
- Dense lawn of primer on the surface of the flow cell

Flow Cell



#### 2. ATTACH DNA TO SURFACE



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

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# Attach DNA to Surface

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- Dense lawn of primer on the surface of the flow cell

Flow Cell



#### 3. BRIDGE AMPLIFICATION



Add unlabeled nucleotides and enzyme to initiate solid-phase bridge amplification.

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# **Bridge Amplification**

 Unlabeled nucleotides and polymerase enzyme are added to initiate the solid phase bridge amplification

#### 3. BRIDGE AMPLIFICATION



Add unlabeled nucleotides and enzyme to initiate solid-phase bridge amplification.

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# **Bridge Amplification**

 Unlabeled nucleotides and polymerase enzyme are added to initiate the solid phase bridge amplification

4. FRAGMENTS BECOME DOUBLE STRANDED



The enzyme incorporates nucleotides to build double-stranded bridges on the solidphase substrate.

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### Fragments Become Double Stranded

- In this step it demonstrates the work done by the sequencing reagents
  - Primers
  - Nucleotides
  - Polymerase enzymes
  - Buffer

4. FRAGMENTS BECOME DOUBLE STRANDED



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Denaturation leaves single-stranded templates anchored to the substrate.

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## Denature the Double Stranded Molecules

 The original strand is then washed away, leaving only the strands that had been synthesized to the oligos attached to the flow cell 5. DENATURE THE DOUBLE-STRANDED MOLECULES



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## Steps 5-7 Repeats

- Cycle of new strand synthesis and Denaturation to make multiple copies of the same sequence (amplification)
  - Fragments Become Double Stranded
  - Denature the Double Strand Molecules





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- Cycle of new strand synthesis and Denaturation to make multiple copies of the same sequence (amplification)
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#### 7. DETERMINE FIRST BASE



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

Image retrieved from <u>http://res.illumina.com/</u> <u>documents/products/techspotlights/</u> <u>techspotlight\_sequencing.pdf</u>

## **Determine First Base**

- The P5 region is cleaved
- Add sequencing reagents
  - Primers
  - Polymerase
  - Fluorescently labeled nucleotides
  - Buffer
- First base incorporated

#### 7. DETERMINE FIRST BASE



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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.

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## Image First Base

- Remove unincorporated bases
- Detect Signal
- Deblock and remove the fluorescent signal → new cycle



Image retrieved from http://research.stowers-institute.org/microscopy/external PowerpointPresentations/ppt/Methods\_Technology/ KSH\_Tech&Methods\_012808Final.pdf





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.

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- Remove unincorporated bases
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#### 9. DETERMINE SECOND BASE



Second chemistry cycle: to initiate the next sequencing cycle, add all four labeled reversible terminators and enzyme to the flow cell.

Image retrieved from <u>http://res.illumina.com/</u> <u>documents/products/techspotlights/</u> <u>techspotlight\_sequencing.pdf</u>

## Determine Second Base

- Add sequencing reagents
  - Primers
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Second chemistry cycle: to initiate the next sequencing cycle, add all four labeled reversible terminators and enzyme to the flow cell.

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## Determine Second Base

- Add sequencing reagents
  - Primers
  - Polymerase
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- Second base incorporated

10. IMAGE SECOND CHEMISTRY CYCLE



After laser excitation, collect the image data as before. Record the identity of the second base for each cluster.

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## Image Second Chemistry Cycle

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11. SEQUENCE READS OVER MULTIPLE CHEMISTRY CYCLES



Repeat cycles of sequencing to determine the sequence of bases in a given fragment a single base at time.

Image retrieved from <u>http://res.illumina.com/</u> <u>documents/products/techspotlights/</u> <u>techspotlight\_sequencing.pdf</u>

#### Sequence Reads Over Multiple Chemistry Cycles

 The identity of each base of a cluster is read off from sequential images



Image retrieved from <u>http://research.stowers-institute.org/microscopy/external/</u> <u>PowerpointPresentations/ppt/Methods\_Technology/KSH\_Tech&Methods\_012808Final.pdf</u> 11. SEQUENCE READS OVER MULTIPLE CHEMISTRY CYCLES



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#### Sequencing by synthesis



#### Actual Illumina HiSeq 3000 image

http://dnatech.genomecenter.ucdavis.edu/2015/05/07/first-hiseq-3000-data-download/ This and following slides marked with \* courtesy of Ben Langmead

#### Sequencing by synthesis

Billions of templates on a slide

Massively parallel: photograph captures all templates simultaneously

Terminators are "speed bumps," keeping reactions in sync



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Billions of templates on a slide

Massively parallel: photograph captures all templates simultaneously

Terminators are "speed bumps," keeping reactions in sync


















### Q = -10 · log10 p

## Q = -10 · log10 p / Base quality





Q = 10 → 1 in 10 chance call is incorrect Q = 20 → 1 in 100 Q = 30 → 1 in 1,000







Estimate p, probability incorrect:



Estimate p, probability incorrect: non-orange light / total light



Estimate p, probability incorrect: non-orange light / total light

p = 3 green / 9 total = 1/3



Estimate p, probability incorrect: non-orange light / total light

p = 3 green / 9 total = 1/3Q = -10 log10 1/3



Estimate p, probability incorrect: non-orange light / total light

p = 3 green / 9 total = 1/3 $Q = -10 \log_{10} 1/3 = 4.77$ 

@ERR194146.1 HSQ1008:141:D0CC8ACXX:3:1308:20201:36071/1
ACATCTGGTTCCTACTTCAGGGCCATAAAGCCTAAATAGCCCACACGTTCCCCTTAAAT
+
?@@FFBFFDDHHBCEAFGEGIIDHGH@GDHHHGEHID@C?GGDG@FHIGGH@FHBEG:G

#### Name @ERR194146.1 HSQ1008:141:D0CC8ACXX:3:1308:20201:36071/1 ACATCTGGTTCCTACTTCAGGGCCATAAAGCCTAAATAGCCCACACGTTCCCCTTAAAT + ?@@FFBFFDDHHBCEAFGEGIIDHGH@GDHHHGEHID@C?GGDG@FHIGGH@FHBEG:G

#### Name @ERR194146.1 HSQ1008:141:D0CC8ACXX:3:1308:20201:36071/1 Sequence ACATCTGGTTCCTACTTCAGGGCCATAAAGCCTAAATAGCCCACACGTTCCCCTTAAAT + ?@@FFBFFDDHHBCEAFGEGIIDHGH@GDHHHGEHID@C?GGDG@FHIGGH@FHBEG:G

#### Name @ERR194146.1 HSQ1008:141:D0CC8ACXX:3:1308:20201:36071/1 Sequence ACATCTGGTTCCTACTTCAGGGCCATAAAGCCTAAATAGCCCACACGTTCCCCTTAAAT (ignore) + ?@@FFBFFDDHHBCEAFGEGIIDHGH@GDHHHGEHID@C?GGDG@FHIGGH@FHBEG:G

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#### FASTQ

	● ● ● ●	ads — Example — bash — 104×25
	<pre>\$ head -20 SRA_HISEQ2000_FC1.shuffle.2M.</pre>	1.fastq
Name	@509.6.64.20524.149722	
Dood 1 Sequence	AGCTCTGGTGACCCATGGGCAGCTGCTAGGGAGCCTTCTC	TCCACCCTGAAAATAGCTTCTGGCTGNTGGGTGAACTATGGAGAGAAAGCGTTTTATTAT
neau i (placeholder)	+	
Base qualities	ННННННGHHHHHHHHHHHHHHHHHHHHHHHHHHHH	IIHHIHFHHFHHHIHGEHHIIFIHBC#@:@9,541436D9?;E####################################
Name	@509.4.62.19231.2763	
Dood O Sequence	GTTGATAAGCAAGCATCTCATTTTGTGCATATACCTGGTC	TTTCGTATTCTGGCGTGAAGTCGCCGNCTGAATGCCAGCAATCTCTTTTTGAGTCTCATT
neau <u>(placeholder)</u>	+	
Base qualities	ННИННИННИННЕННИННИННИННИННИННИННИННИН	HHHHHGHGHHHHHHHHHHHH=EF?DHE4#555=;===GGHEGGEGHG@C@<7<3@?F <a9@<< th=""></a9@<<>
Name	@509.6.47.3027.76579	
Dood 2 Sequence	CCTTTTCGACTAGAGACTGCCAAGTGCCAAAATATCCACT	TGCAGATACTACAACAAGAGTGTTTCNAAACTGCTCAATCAAAAGAAATGTTCAACTCTT
neau J (placeholder)	+	
Base qualities	нннннннннннннннннт	GHHHHHHHGHHHHHHHHHHHHHHHH#554DDADDHHHHHH@GHHFGBBFFHFHFHEHHH
Name	@509.2.7.2951.186312	
Road / Sequence		CAATAAGGCAGTGTTAAGAGGAAAATTAATAGCACTAAATGCCCACATCAAAAAGTTAGA
IICAU + (placeholder)	+	
Base qualities	ННННННННННННННННННННННН	HHHHGHHHHHHEHEF <@=BBFFFGCFFE?<;@AFG=GA;@D@D?FDFFB=B;F= AA@
Name	@509.6.25.8102.140546	
Road 5 Sequence	GGACACATTCAAACCATTGCATCCATCCTCTGCATTCAGA	AAGATAGTCCAACAGAAAGATCTGGANTCAAGAGACCCAGCTGATTACCAATTCCAGTTT
I LEAU J (placeholder)	+	
Base qualities	нниннинниннинниннинниннинниннинниннин	HHHHHHHHHHHHHHHHHHHHHHHHHG#FFDCDD@@GGGHHFIHEGIFIEIIIIGIIGFGF
	\$	

N

#### **Base qualities**

Bases and qualities line up:

# AGCTCTGGTGACCCATGGGCAGCTGCTAGGGA

Base quality is ASCII-encoded version of  $Q = -10 \log_{10} p$ 

## Long-read sequencing via nanopores



Following slides taken or adapted from Mike Schatz: http://schatz-lab.org/appliedgenomics2019/lectures05.LinkedAndLongReads.pdf

## Nanopore Sequencing

Sequences DNA/RNA by measuring changes in ionic current as nucleotide strand passes through a pore



nanoporetech.com/applications/dna-nanopore-sequencing

## **Oxford Nanopore MinION**



Salt solution



## "Ultra-Long Read" Assembly

nature OPEN

biotechnology

#### Nanopore sequencing and assembly of a human genome with ultra-long reads

Miten Jain<sup>1,13</sup>, Sergey Koren<sup>2,13</sup>, Karen H Miga<sup>1,13</sup>, Josh Quick<sup>3,13</sup>, Arthur C Rand<sup>1,13</sup>, Thomas A Sasani<sup>4,5,13</sup>, John R Tyson<sup>6,13</sup>, Andrew D Beggs<sup>7</sup>, Alexander T Dilthey<sup>20</sup>, Ian T Fiddes<sup>1</sup>, Sunir Malla<sup>8</sup>, Hannah Marriott<sup>8</sup>, Tom Nieto<sup>7</sup>, Justin O'Grady<sup>9</sup>, Hugh E Olsen<sup>1</sup>, Brent S Pedersen<sup>4,5</sup>, Arang Rhie<sup>2</sup>, Hollian Richardson<sup>9</sup>, Aaron R Quinlan<sup>4,5,10</sup>, Terrance P Snutch<sup>6</sup>, Louise Tee<sup>7</sup>, Benedict Paten<sup>1</sup>, Adam M Phillippy<sup>2</sup>, Jared T Simpson<sup>11,12</sup>, Nicholas J Loman<sup>3</sup> & Matthew Loose<sup>8</sup>

We report the sequencing and assembly of a reference genome for the human GM12878 Utah/Ceph cell line using the MinION (Oxford Nanopore Technologies) nanopore sequencer. 91.2 Gb of sequence data, representing ~30x theoretical coverage, were produced. Reference-based alignment enabled detection of large structural variants and epigenetic modifications. De novo assembly of nanopore reads alone yielded a contiguous assembly (NG50 ~3 Mb). We developed a protocol to generate ultra-long reads (N50 > 100 kb, read lengths up to 882 kb). Incorporating an additional 5x coverage of these ultra-long reads more than doubled the assembly contiguity (NG50 ~6.4 Mb). The final assembled genome was 2.867 million bases in size, covering 85.8% of the reference. Assembly accuracy, after incorporating complementary short-read sequencing data, exceeded 99.8%. Ultra-long reads enabled assembly and phasing of the 4-Mb major histocompatibility complex (MHC) locus in its entirety, measurement of telomere repeat length, and closure of gaps in the reference human genome assembly GRCh38.

The human genome is used as a yardstick to assess performance of algorithms and the use of long noisy data in conjunction with accu-DNA sequencing instruments1-5. Despite improvements in sequencing technology, assembling human genomes with high accuracy and completeness remains challenging. This is due to size (~3.1 Gb), heterozygosity, regions of GC% bias, diverse repeat families, and segmental duplications (up to 1.7 Mbp in size) that make up at least 50% tromeric, and acrocentric short arms of chromosomes, which contain satellite DNA and tandem repeats of 3-10 Mb in length7.8. Repetitive structures pose challenges for de novo assembly using "short read" highly accurate genotyping in non-repetitive regions, do not provide repetitive sequences, detect complex structural variation, and fully characterize the human genome.

ing reads have significantly higher error rates compared with Illumina

sequencing. This has necessitated development of de novo assembly

contiguous de novo assemblies. This limits the ability to reconstruct that whole-genome sequencing (WGS) of a human genome might be Single-molecule sequencers, such as Pacific Biosciences' (PacBio), can produce read lengths of 10 kb or more, which makes de novo human genome assembly more tractable9. However, single-molecule sequenc-

rate short reads to produce high-quality reference genomes10. In May 2014, the MinION nanopore sequencer was made available to earlyaccess users11. Initially, the MinION nanopore sequencer was used to sequence and assemble microbial genomes or PCR products<sup>12-14</sup> because the output was limited to 500 Mb to 2 Gb of sequenced bases. of the genome<sup>6</sup>. Even more challenging are the pericentromeric, cen- More recently, assemblies of eukaryotic genomes including yeasts, fungi, and Caenorhabditis elegans have been reported15-17.

Recent improvements to the protein pore (a laboratory-evolved Escherichia coli CsgG mutant named R9.4), library preparation techsequencing technologies, such as Illumina's. Such data, while enabling niques (1D ligation and 1D rapid), sequencing speed (450 bases/s), and control software have increased throughput, so we hypothesized feasible using only a MinION nanopore sequencer<sup>17-19</sup>.

> We report sequencing and assembly of a reference human genome for GM12878 from the Utah/CEPH pedigree, using MinION R9.4 1D chemistry, including ultra-long reads up to 882 kb in length. GM12878 has been sequenced on a wide variety of platforms, and has well-validated variation call sets, which enabled us to benchmark our results<sup>20</sup>.

Received 20 April 2017; accepted 11 December 2017; published online 29 January 2018; doi:10.1038/nbt.4060

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## **Current Nanopore Assembly**

OPEN

nature

#### Nanopore sequencing and assembly of a human genome with ultra-long reads

Miten Jain<sup>1,13</sup><sup>(1)</sup>, Sergey Koren<sup>2,13</sup>, Karen H Miga<sup>1,13</sup>, Josh Quick<sup>3,13</sup>, Arthur C Rand<sup>1,13</sup>, Thomas A Sasani<sup>4,5,13</sup><sup>(2)</sup>, John R Tyson<sup>6,13</sup>, Andrew D Beggs<sup>7</sup><sup>(0)</sup>, Alexander T Dilthey<sup>2</sup><sup>(0)</sup>, Ian T Fiddes<sup>1</sup>, Sunir Malla<sup>8</sup>, Hannah Marriott<sup>8</sup>, Tom Nieto<sup>7</sup>, Justin O'Grady<sup>9</sup><sup>(0)</sup>, Hugh E Olsen<sup>1</sup>, Brent S Pedersen<sup>4,5</sup>, Arang Rhie<sup>2</sup><sup>(0)</sup>, Hollian Richardson<sup>9</sup>, Aaron R Quinlan<sup>4,5,10</sup><sup>(6)</sup>, Terrance P Snutch<sup>6</sup>, Louise Tee<sup>7</sup>, Benedict Paten<sup>1</sup>, Adam M Phillippy<sup>2</sup>, Jared T Simpson<sup>11,12</sup>, Nicholas J Loman<sup>3</sup> & Matthew Loose<sup>8</sup><sup>(0)</sup>

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rights

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<sup>1</sup>UC Santa Cruz Genomics Institute, University Branch, National Human Genome Research In UtA, <sup>1</sup>Oppartment of Human Genetics, Universi Utah, USA, <sup>6</sup>Michael Smith Laboratories and I Laboratory, Institute of Cancer, & Genomic Scie Medical School, University of East Anglia, Non for Cancer Research, Toronto, Canada, <sup>12</sup>Oppa Correspondence should be addressed to N.J.





NATURE BIOTECHNOLOGY ADVANCE

## **Current Nanopore Assembly**

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nature biotechnology

#### Nanopore sequencing and assembly of a human genome with ultra-long reads

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We report the sequencing and assembly of a reference genome for the human GM12878 Utah/Ceph cell line using the MinION (Oxford Nanopore Technologies) nanopore sequencer. 91.2 Gb of sequence data, representing ~30x theoretical

#### Same group recently reported a read 2.3 million bases long!

2,272,580 nt, to be exact.

#### No theoretical upper limit

coverage, were produced. Referenc modifications. De novo assembly o protocol to generate ultra-long read of these ultra-long reads more than 2.867 million bases in size, coveri short-read sequencing data, exceed histocompatibility complex (MHC)

rights

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mental duplications (up to 1.7 Mbp in s of the genome6. Even more challenging tromeric, and acrocentric short arms of satellite DNA and tandem repeats of 3structures pose challenges for de novo sequencing technologies, such as Illumi highly accurate genotyping in non-repe contiguous de novo assemblies. This lir



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NATURE BIOTECHNOLOGY ADVANCE



Translation of raw signal into basepairs



Translation of raw signal into basepairs

Early basecallers began by estimating k-mer boundaries using "events", which were then input to an HMM

Modern basecalers use neural networks directly on raw signal



(Based on probability of event matches)

#### ONT releases k-mer models with expected current distribution of every k-mer



DNA Base-Calling from a Nanopore Using a Viterbi Algorithm Timp et al. (2012) *Biophysical Journal* 



Certain k-mers can be eliminated based on possible transitions



DNA Base-Calling from a Nanopore Using a Viterbi Algorithm Timp et al. (2012) *Biophysical Journal* 



# Final sequence determined by most probable k-mers



"DNA Base-Calling from a Nanopore Using a Viterbi Algorithm" Timp et al. (2012) *Biophysical Journal* 

## **Basecaller/Pore Timeline**

# Development of both pore chemistry and basecalling algorithms is responsible for improvement in accuracy



*From squiggle to basepair: computational approaches for improving nanopore sequencing read accuracy* Rang *et al* (2018) *Genome Biology.* https://doi.org/10.1186/s13059-018-1462-9

## **Basecaller Comparison**



https://github.com/rrwick/Basecalling-comparison

## **New Pore Chemistries**

ONT is developing alternate pore chemistries to improve accuracy, particularly for homopolymers





From 2018 London Calling Keynote

https://vimeo.com/272526835

## **DNA Modification Detection**

Like PacBio, ONT can detect methylation from raw signal

• Or any other modification that changes ionic current



**Piercing the dark matter: bioinformatics of long-range sequencing and mapping** Sedlazeck et al. (2018) *Nature Reviews Genetics.* 19:329

## **Direct RNA-seq**

Standard RNA sequencing (RNA-seq) requires creation of complementary DNA (cDNA)

ONT recently introduced direct RNA sequencing

Allows detection of RNA modifications, and potentially secondary structure



Nanopore native RNA sequencing of a human poly(A) transcriptome Workman et al. *BioRxiv* (https://www.biorxiv.org/content/10.1101/459529v1)

## **ReadUntil Sequencing**

ONT machines can stop sequencing a read and immediately start on another in real-time

• Each channel has four pores, non-active pores have reads docked

Can potentially avoid sequencing unwanted reads

For example: reads that align to the human genome, reads that *do not* align to a
database of pathogens, reads that align to a region already sequenced to a
desired depth

#### MinION has up to 512 active channels, each reading 450 bp/sec

• Actual number of active channels is variable



## **TRADEOFFS OF DIFFERENT TECHS.**

- Illumina sequencing is cheap & ubiquitous
  - Can sequence very deeply, good for measuring abundance
  - Error rate is very low, can be good for detection of small variants
  - Can be combined with other technologies (e.g. linked-reads) to provide many different types of information
  - Reads are short (<=350bp each, fragments <= 1000bp), making assembly difficult
  - Library prep (prior to sequencing) can introduce many biases
- ONT sequencing is getting cheaper
  - Can sequence *very* long reads, transformative for assembly
  - Can be good for detection of large (e.g. structural) variants
  - Error rate is *much* higher than with short reads (getting better)
  - Fewer individual reads raise challenges in quantification-related tasks
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