

# Hybrid Error Correction and De Novo Assembly with Oxford Nanopore

Michael Schatz

Jan 13, 2015  
PAG Bioinformatics



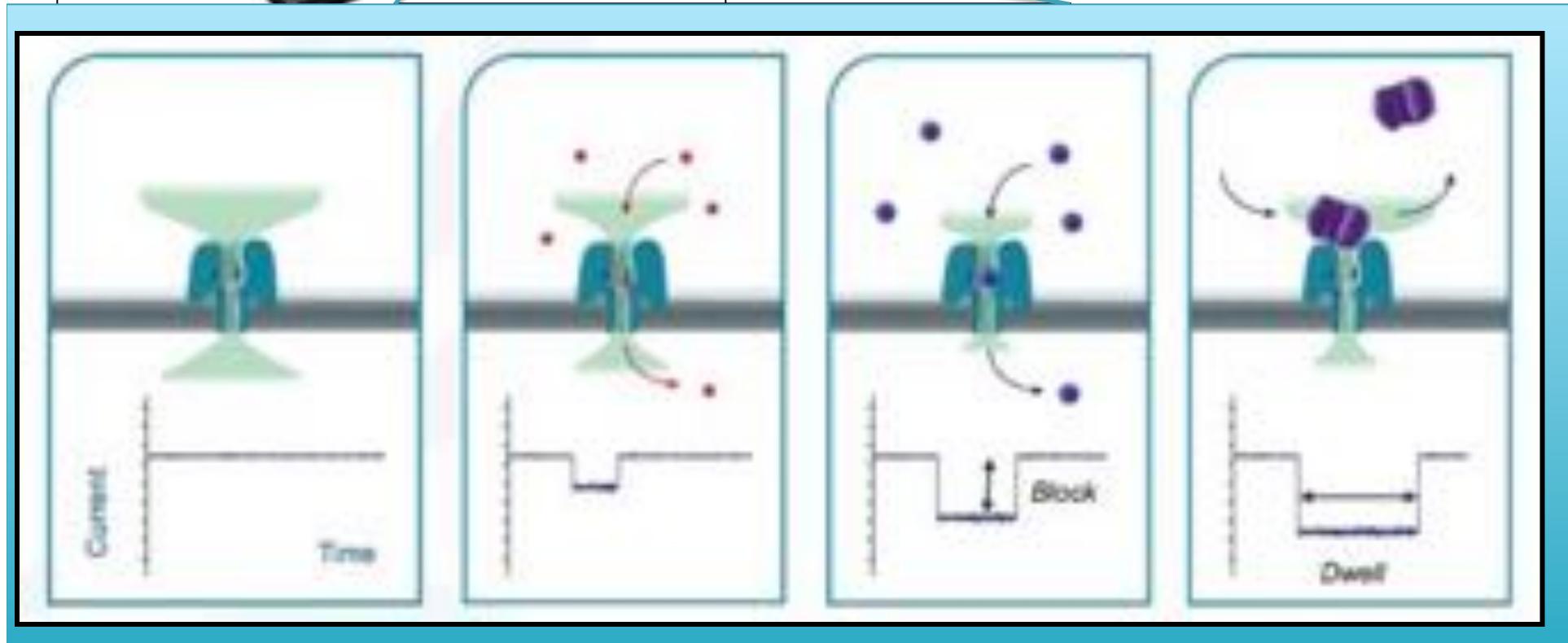
@mike\_schatz / #PAGXXIII



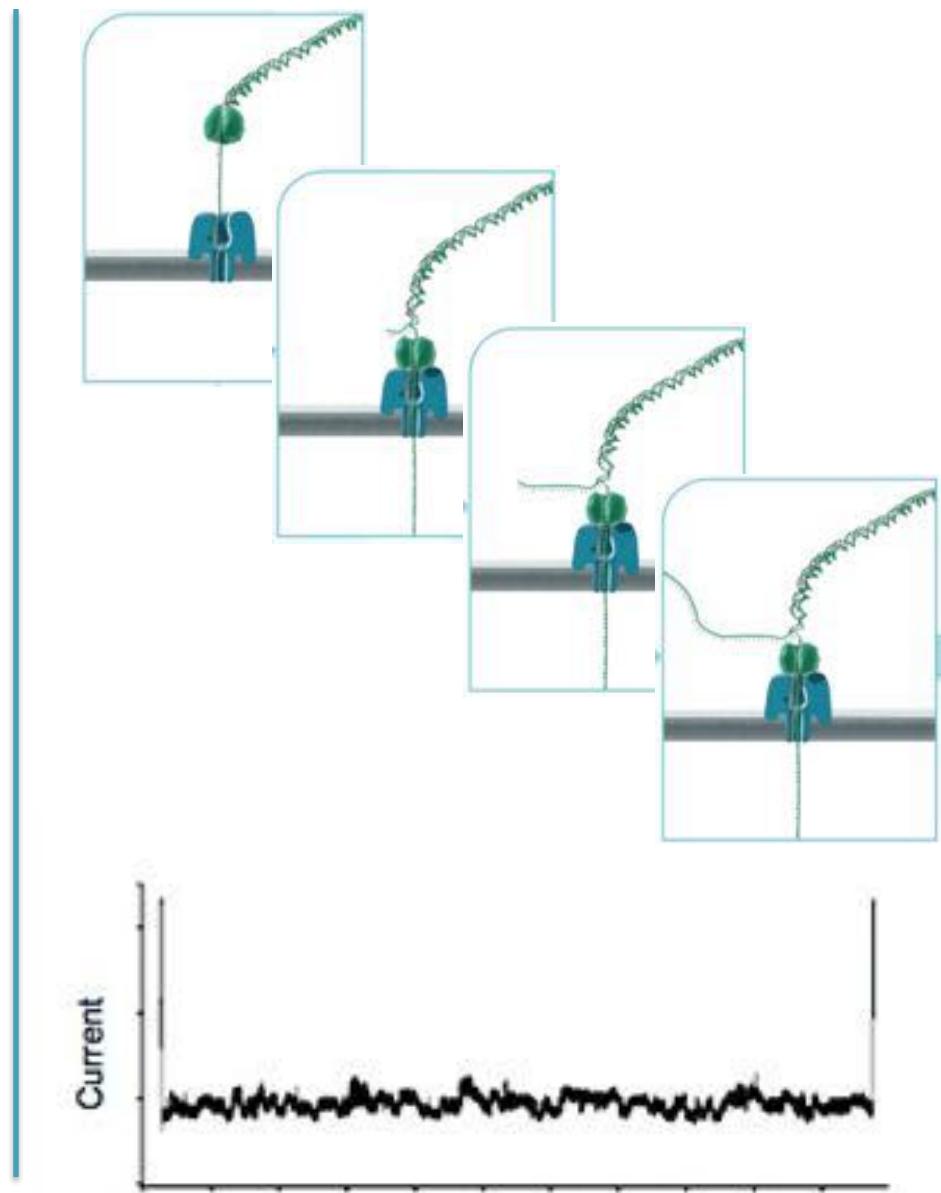
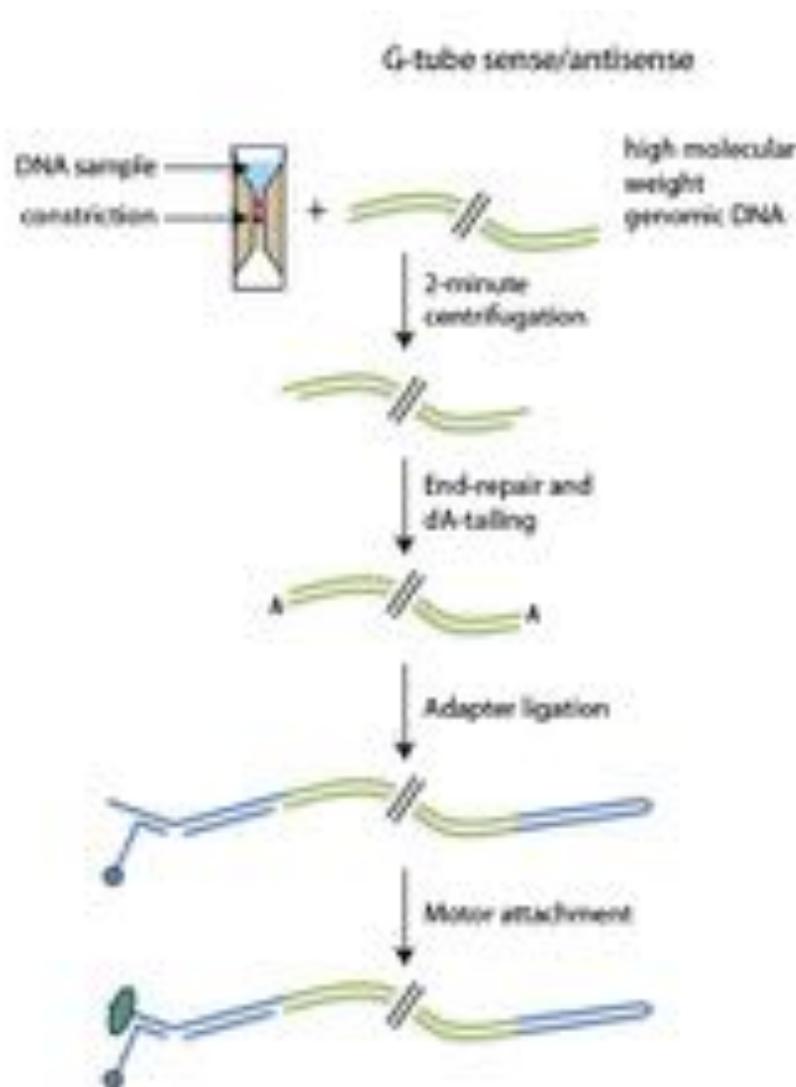
# Oxford Nanopore MinION



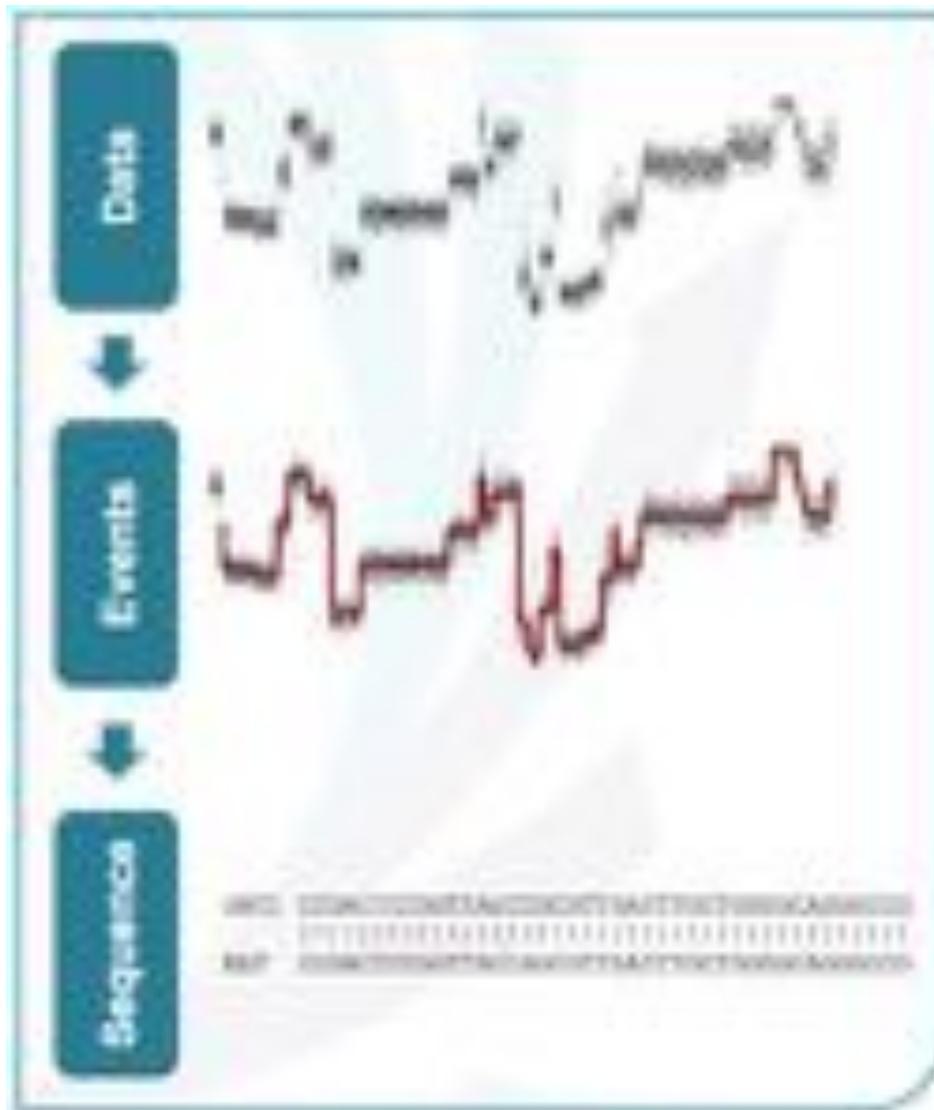
- Thumb drive sized sequencer powered over USB
- Capacity for 512 reads at once
- Senses DNA by measuring changes to ion flow



# Nanopore Sequencing



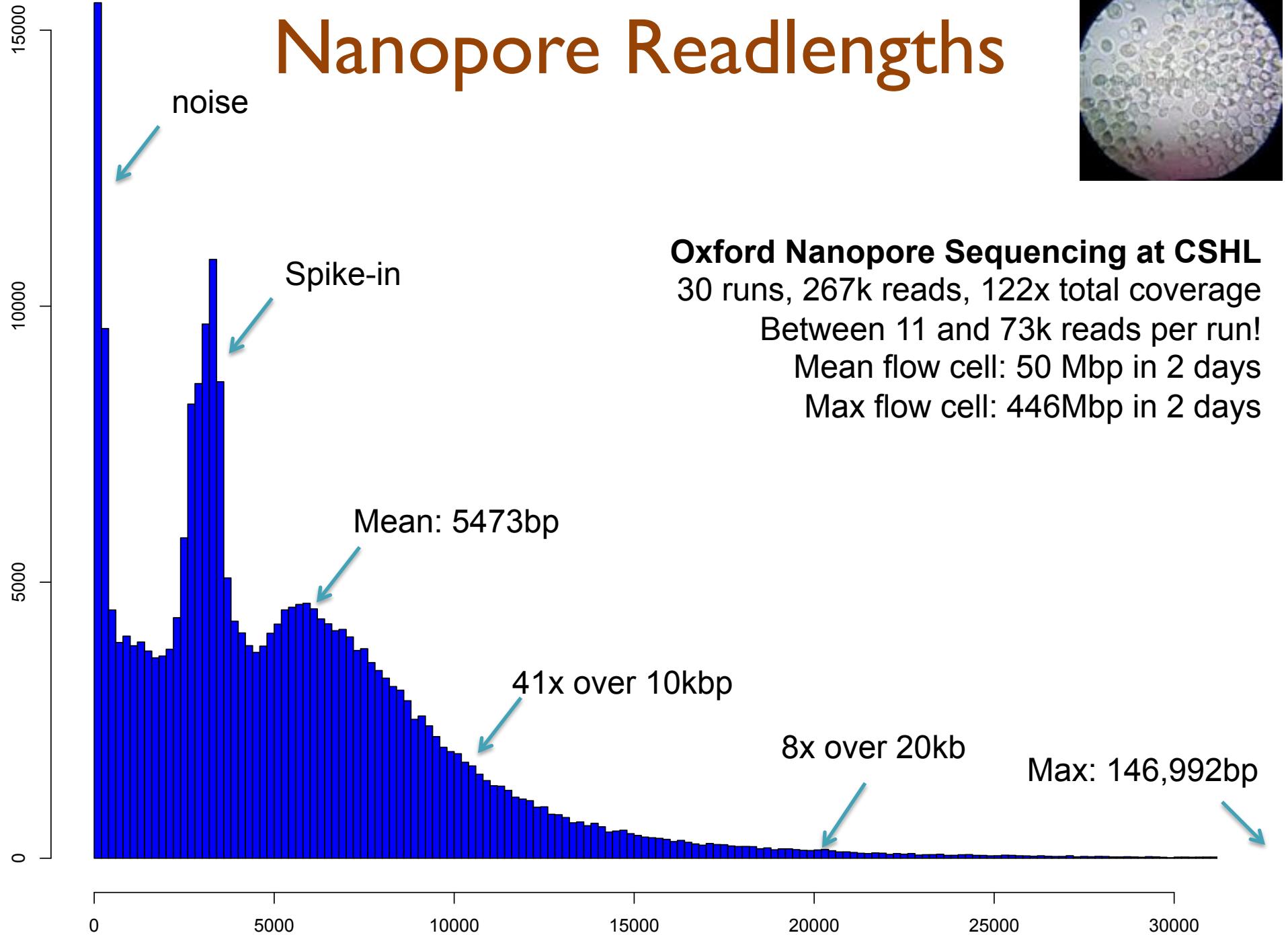
# Nanopore Basecalling



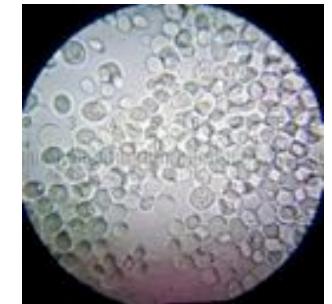
- + Hidden Markov model
  - + Only four options per transition
  - + Pore type = distinct kmer length
- 
- ```
graph LR; TAGGG --> AGGGT; AGGGT --> TGGGT; AGGGT --> GGGTC; TGGGT --> GGGTC;
```
- + Form probabilistic path through measured states currents and transitions
    - e.g. Viterbi algorithm

Basecalling currently performed at Amazon with frequent updates to algorithm

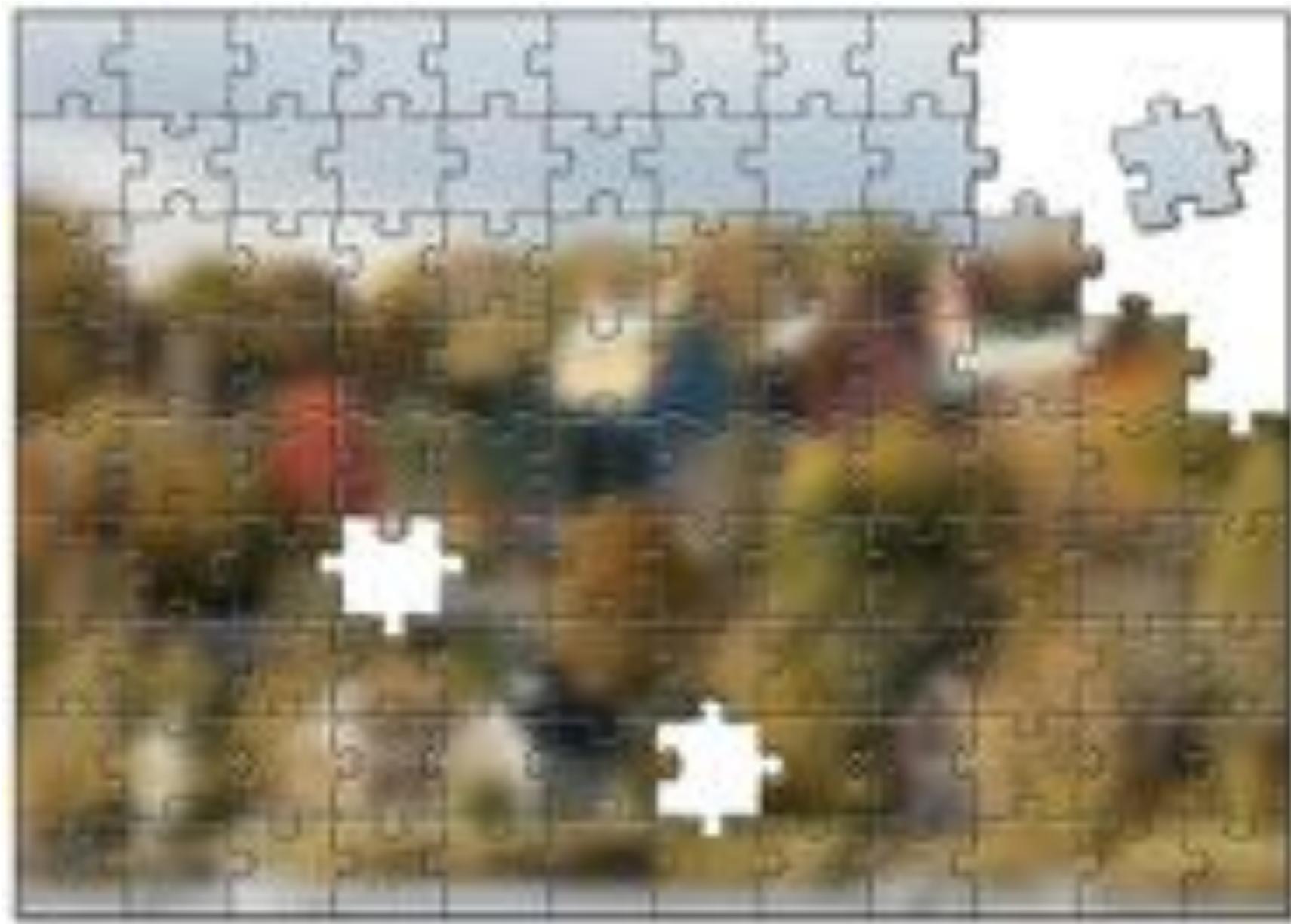
# Nanopore Readlengths



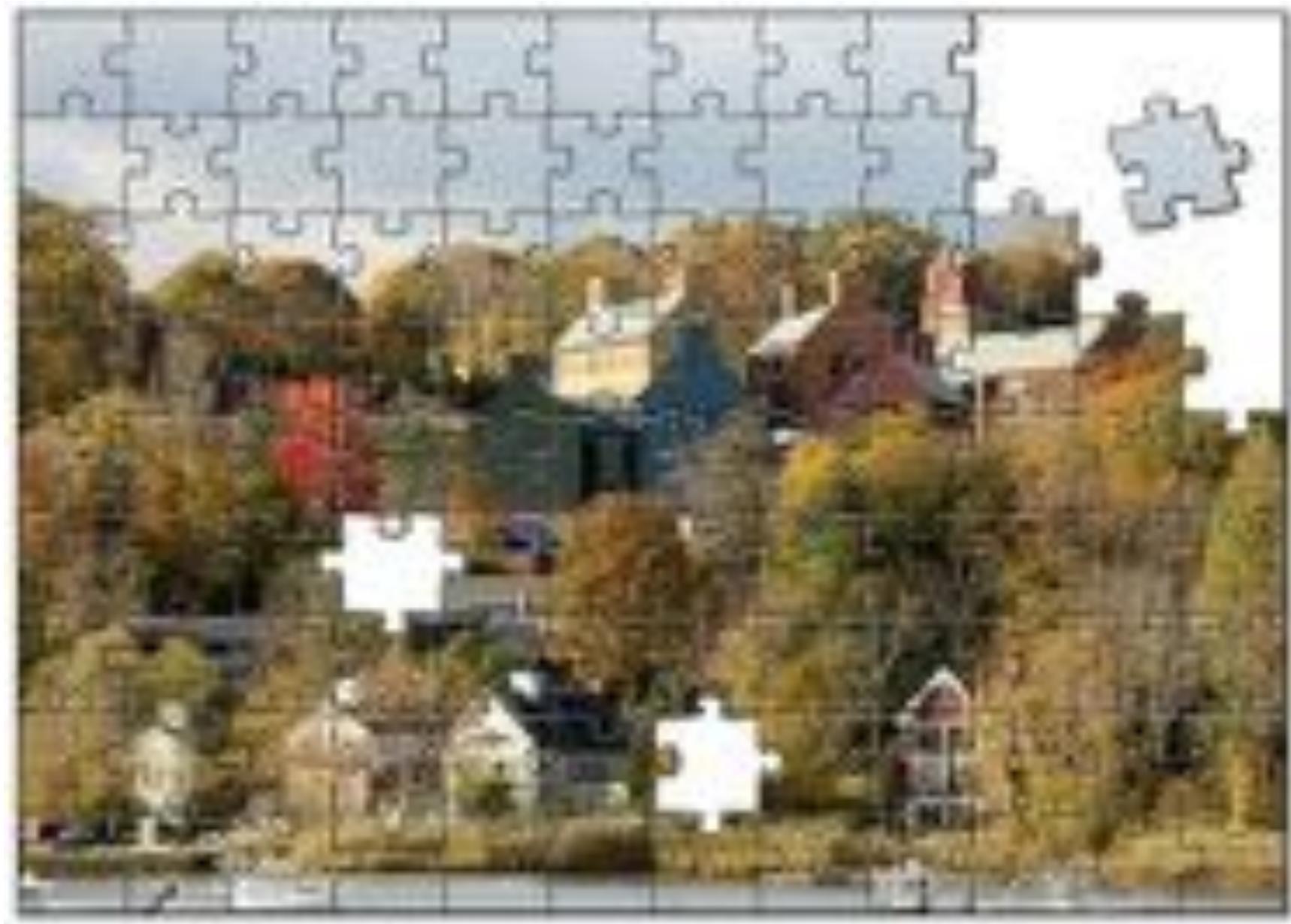
**Oxford Nanopore Sequencing at CSHL**  
30 runs, 267k reads, 122x total coverage  
Between 11 and 73k reads per run!  
Mean flow cell: 50 Mbp in 2 days  
Max flow cell: 446Mbp in 2 days



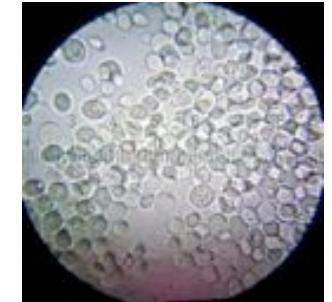
# Nanopore Sequences



# “Corrective Lens” for Sequencing



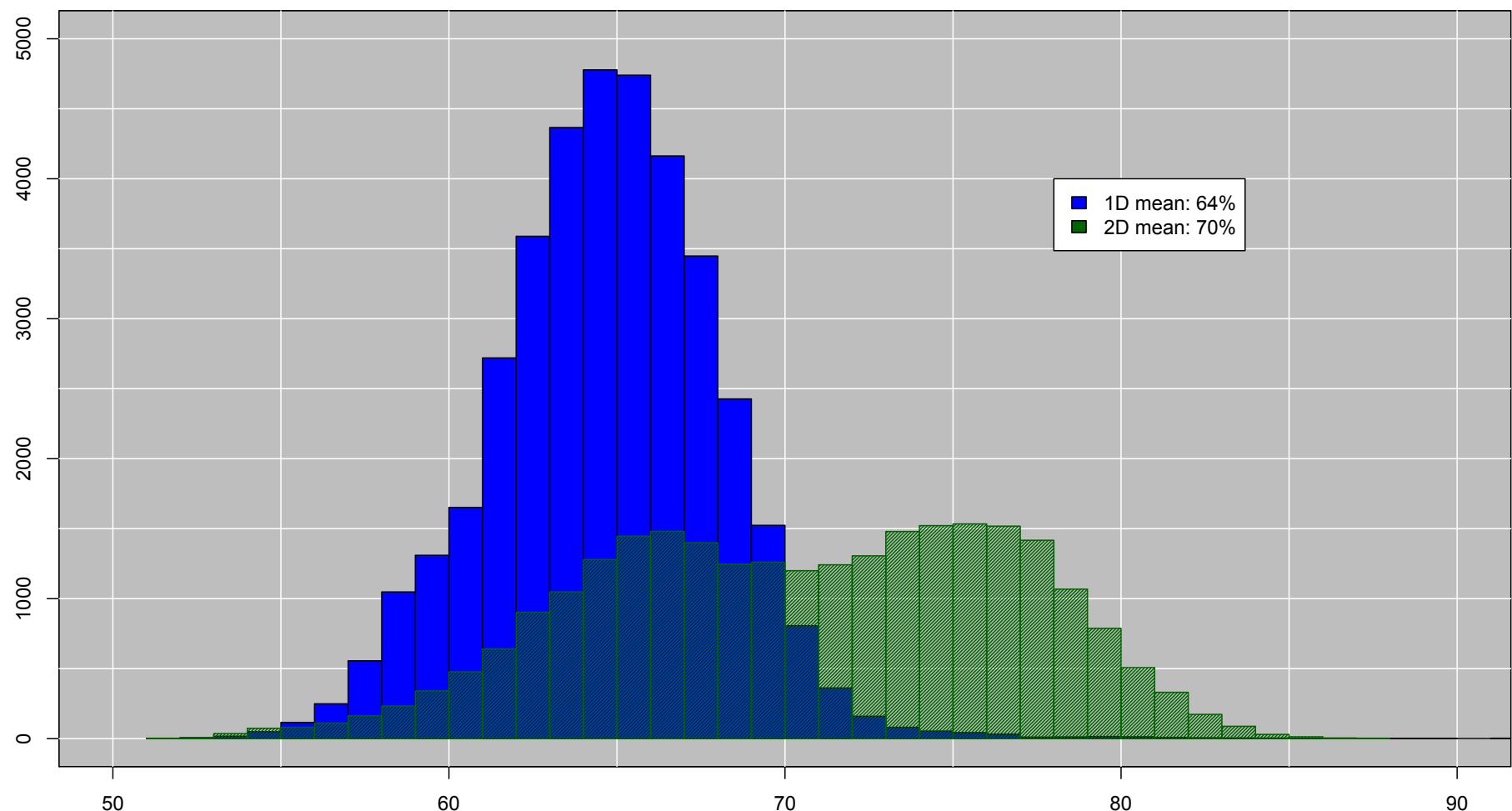
# Nanopore Accuracy



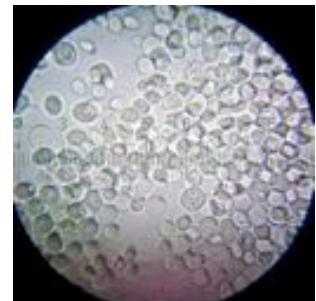
## Alignment Quality (BLASTN)

Of reads that align, average ~64% identity

“2D base-calling” improves to ~70% identity

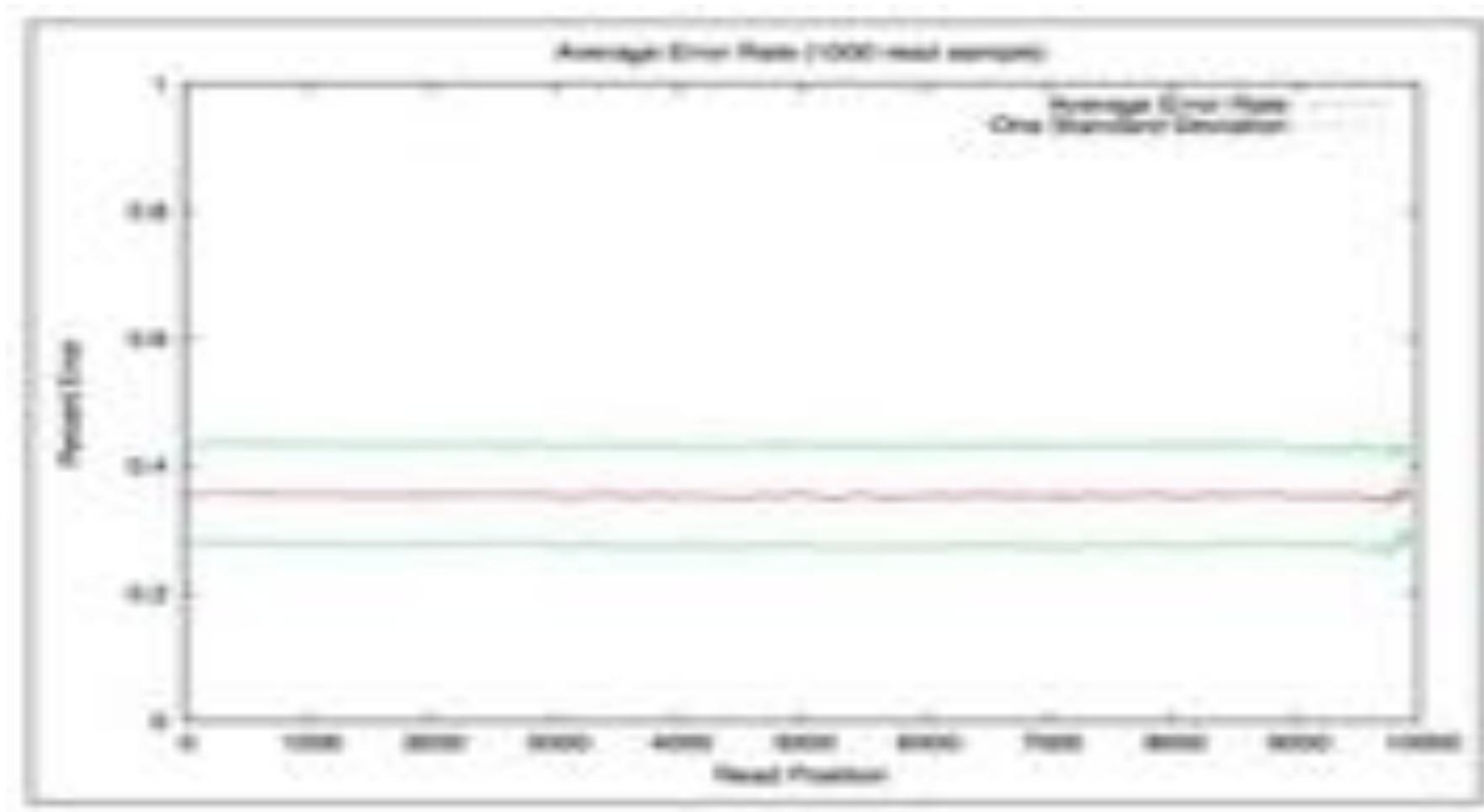


# Nanopore Accuracy

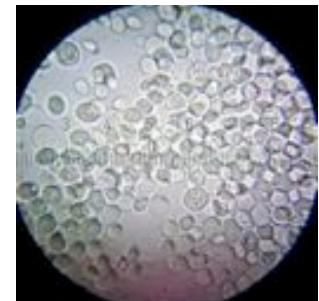


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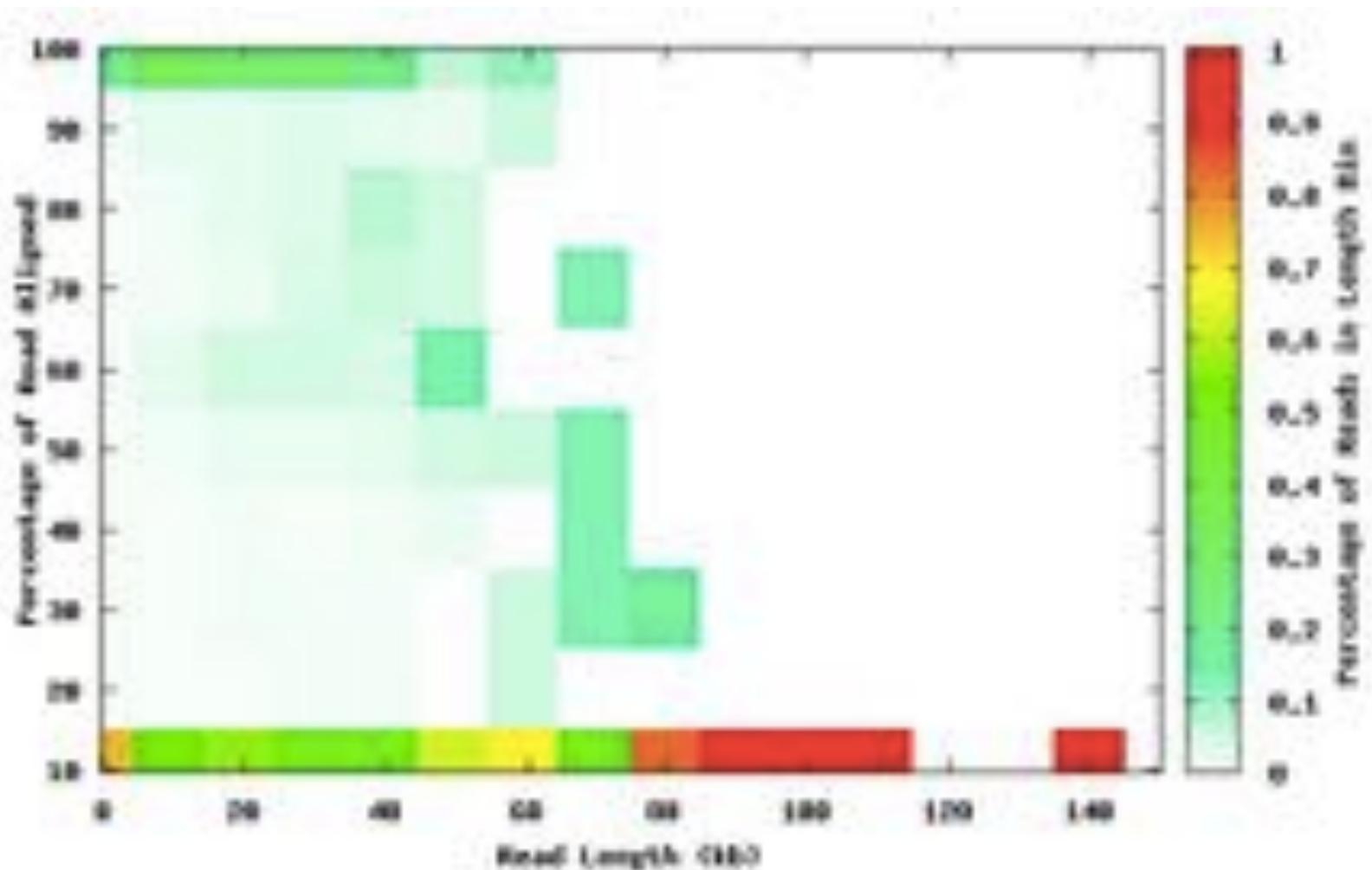
# Nanopore Accuracy



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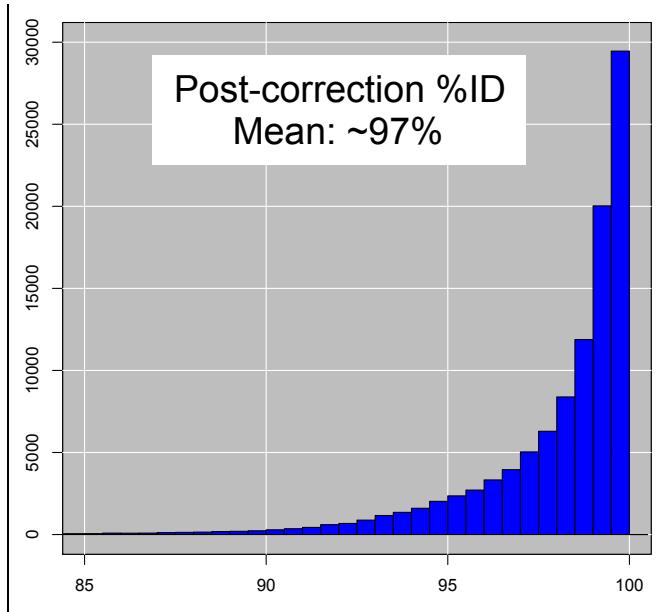
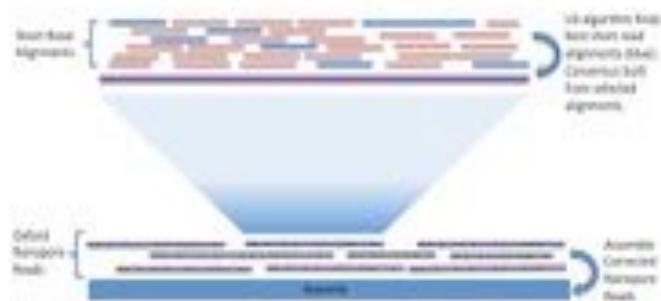


# NanoCorr: Nanopore-Illumina Hybrid Error Correction

<https://github.com/jgurtowski/nanocorr>

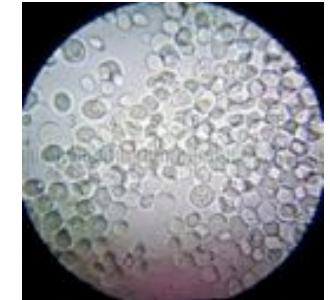


1. BLAST Miseq reads to all raw Oxford Nanopore reads
2. Select non-repetitive alignments
  - First pass scans to remove “contained” alignments
  - Second pass uses Dynamic Programming (LIS) to select set of high-identity alignments with minimal overlaps
3. Compute consensus of each Oxford Nanopore read
  - Currently using Pacbio’s pbpdagcon



**Oxford Nanopore Sequencing and de novo Assembly of a Eukaryotic Genome**  
Goodwin, S, Gurtowski, J et al. (2015) bioRxiv doi: <http://dx.doi.org/10.1101/013490>

# Long Read Assembly



S288C Reference sequence

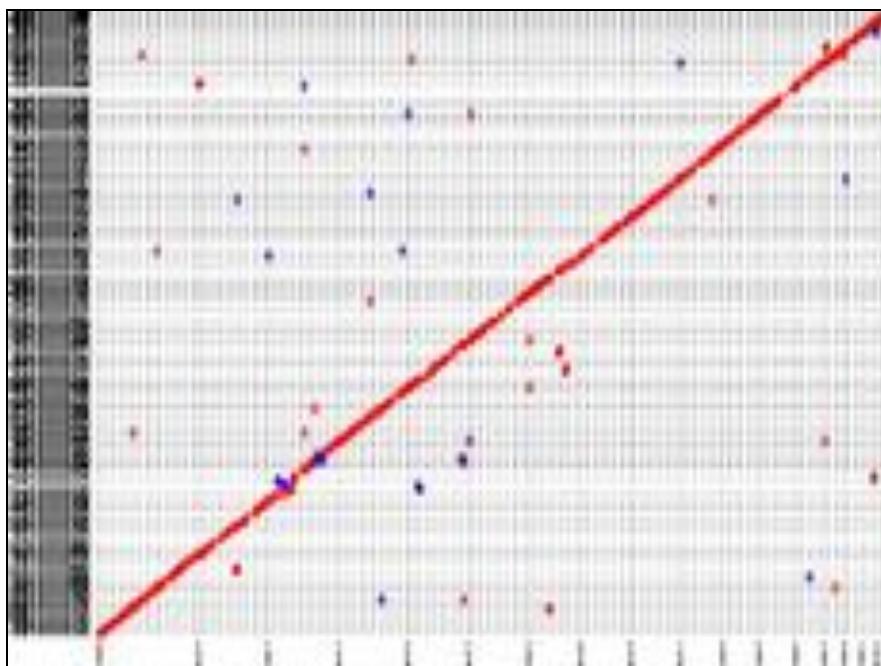
- 12.1Mbp; 16 chromo + mitochondria; N50: 924kbp

## Illumina MiSeq



30x, 300bp PE (Flashed)

- 6953 non-redundant contigs
- N50:59kbp >99.9% id

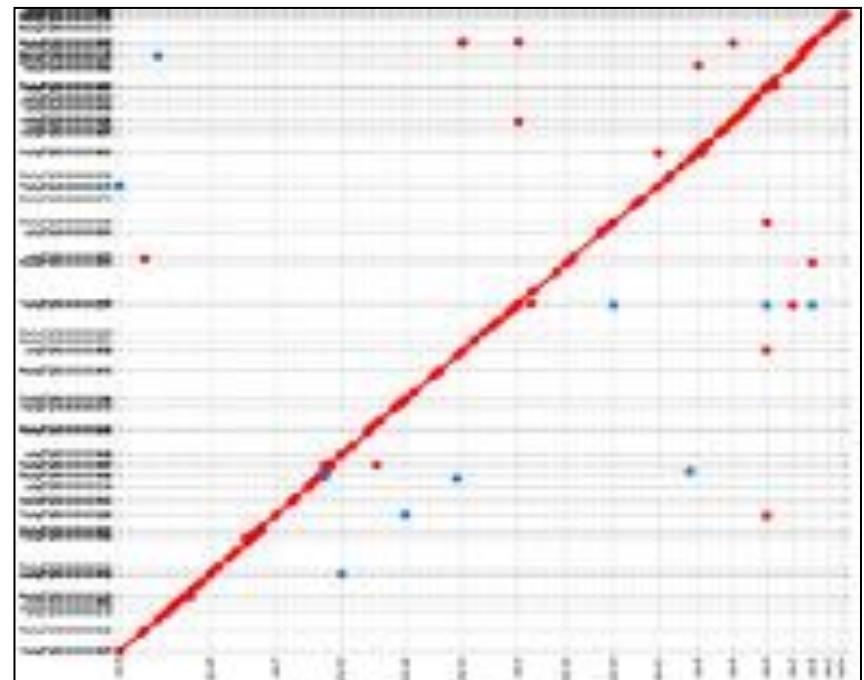


## Oxford Nanopore



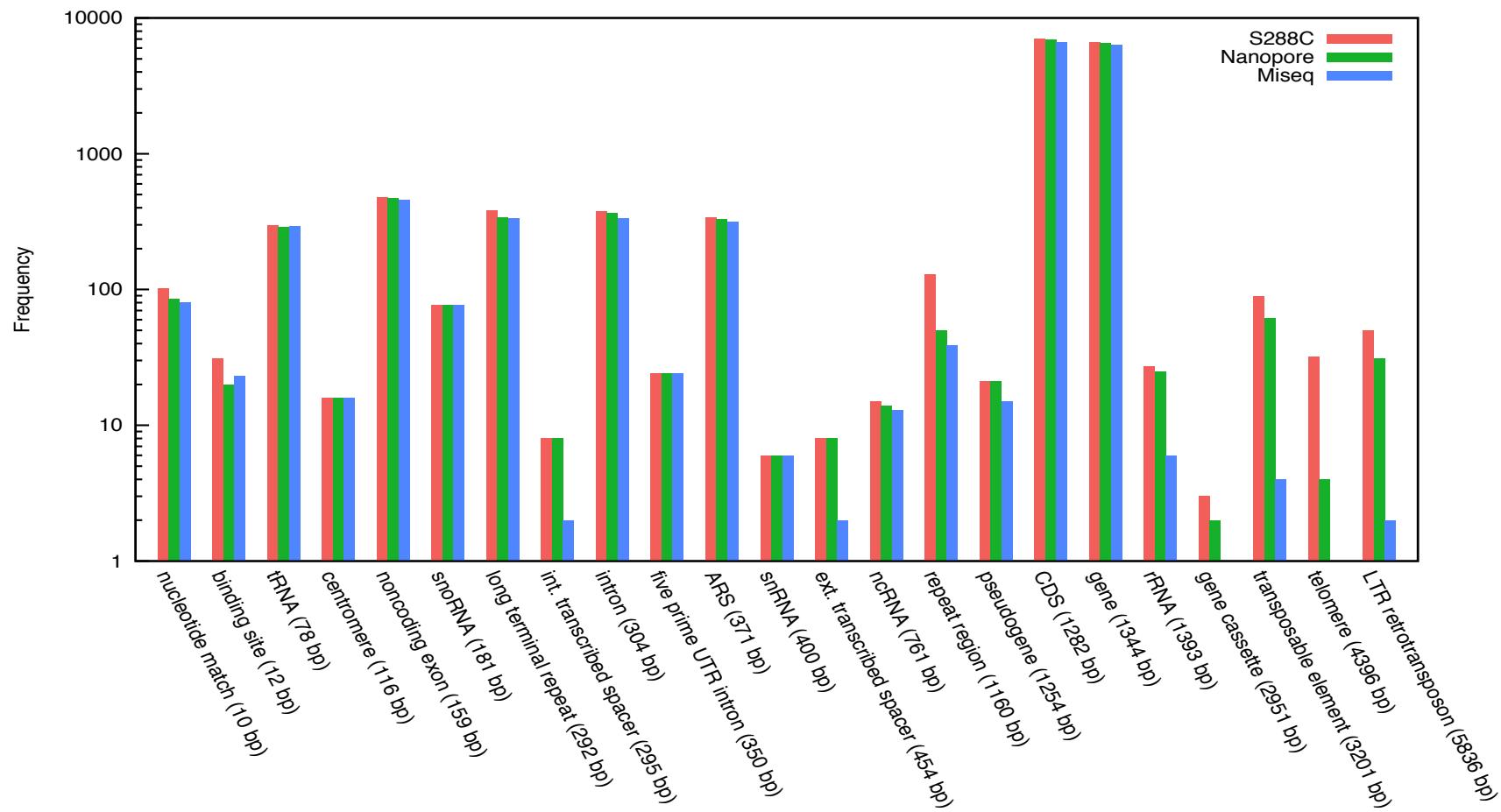
NanoCorr + Celera Assembler

- 214 non-redundant contigs
- N50: 472kbp >99.78% id



# Advantages of Long Reads

In yeast, Nanopore-based assembly is ~10x more contiguous  
In E. coli, Nanopore-based assembly is basically perfect



**Oxford Nanopore Sequencing and de novo Assembly of a Eukaryotic Genome.**

Goodwin, S\*, Gurtowski, J\*, Ethe-Sayers, S, Deshpande, P, Schatz, MC†, McCombie WR† (2014) Under review.

# Genomic Futures?

Zamin Iqbal and 5 others reviewed

GenomeWeb InSequence (@InSequence - Oct 20)

Oxford Nanopore shows off PromethION at ASHG, #ASHG14 @nanopore



# Genomic Futures?



# iGenomics: Mobile Sequence Analysis

Asbyn Palatnick, Elodie Ghedin, Michael Schatz



***The worlds first genomics analysis app for iOS devices***

First application:

- Handheld diagnostics and therapeutic recommendations for influenza infections
- In a few seconds, iGenomics tells you which antivirals to take or avoid
- Coming soon to the App Store

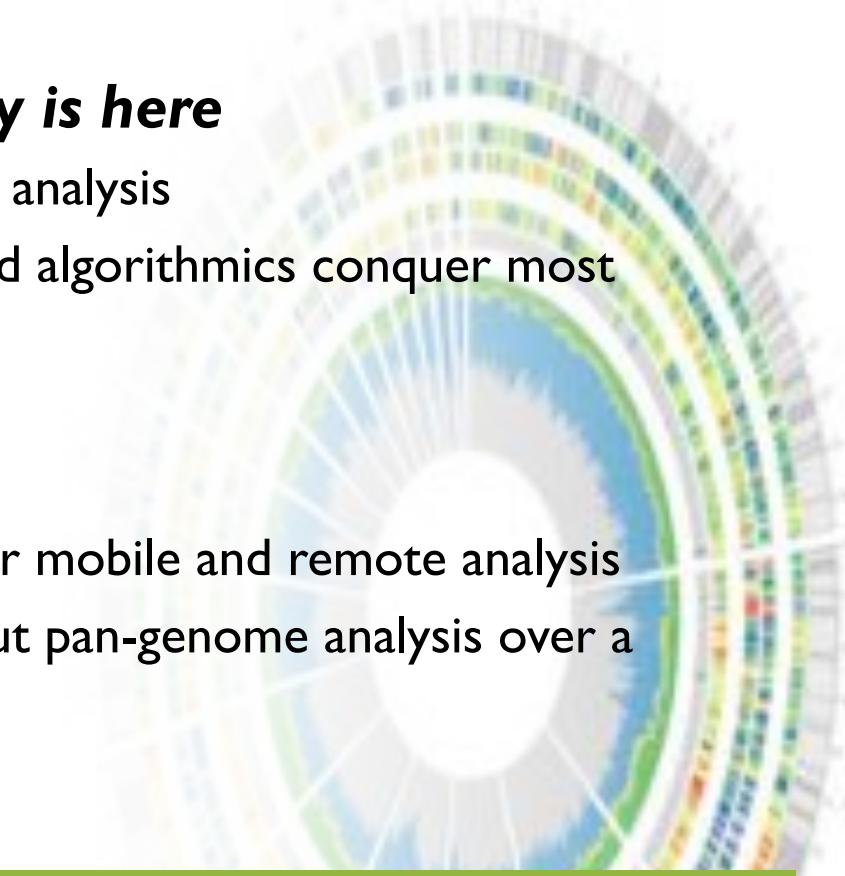
## Future applications

- Pathogen detection
- Food safety
- Biomarkers
- etc..

# Summary & Recommendations

## ***Reference quality genome assembly is here***

- Use the longest possible reads for the analysis
- Don't fear the error rate; coverage and algorithmics conquer most problems



## ***Trends in Algorithmics***

- Exciting developments in the future for mobile and remote analysis
- Now is the time to start thinking about pan-genome analysis over a large number of genomes

**The resurgence of reference quality genome sequence**

Michael Schatz, Ian Korf, Dan Rokhsar

Tuesday @ 4pm, Pacific Salon I

# Acknowledgements

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Jackson Lab  
Hicks Lab  
Iossifov Lab  
Levy Lab  
Lippman Lab  
Lyon Lab  
Martienssen Lab  
**McCombie Lab**  
Tuveson Lab  
Ware Lab  
Wigler Lab  
Pacific Biosciences  
Oxford Nanopore





# Thank you

<http://schatzlab.cshl.edu>

@mike\_schatz / #PAGXXIII