

# The pleasures and perils of assembling insect genomes

Adam M. Phillippy  
Head, Genome Informatics Section, NHGRI



National Human Genome Research Institute  
*Advancing human health through genomics research*

@aphillippy 

# The assembly problem

# Genome assembly with short reads



# Bigger pieces are better

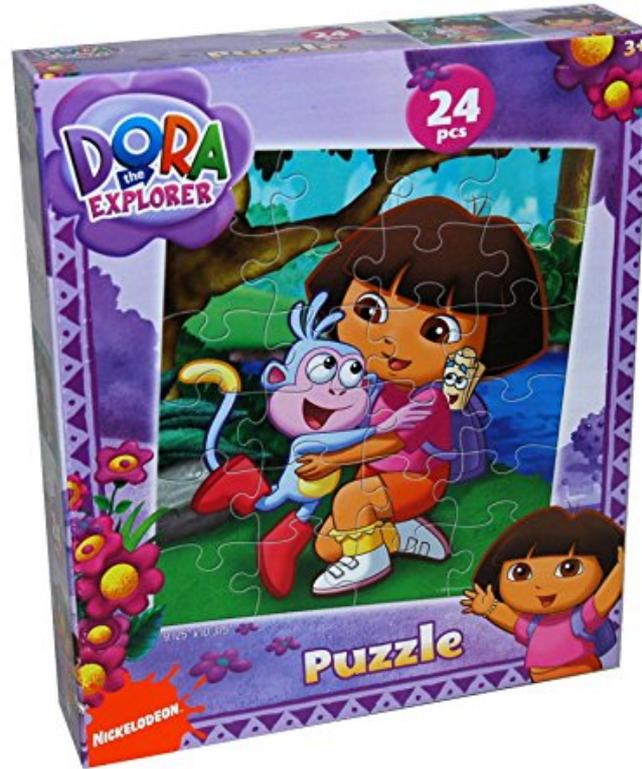
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“It”	>1,000	SSR
“It was”	320	TE
“It was the best”	2	SegDup
“It was the best of times”	1	Unique
“With his hands in his pockets”	3	Meta



# Genome assembly with long reads

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Long reads to the rescue?

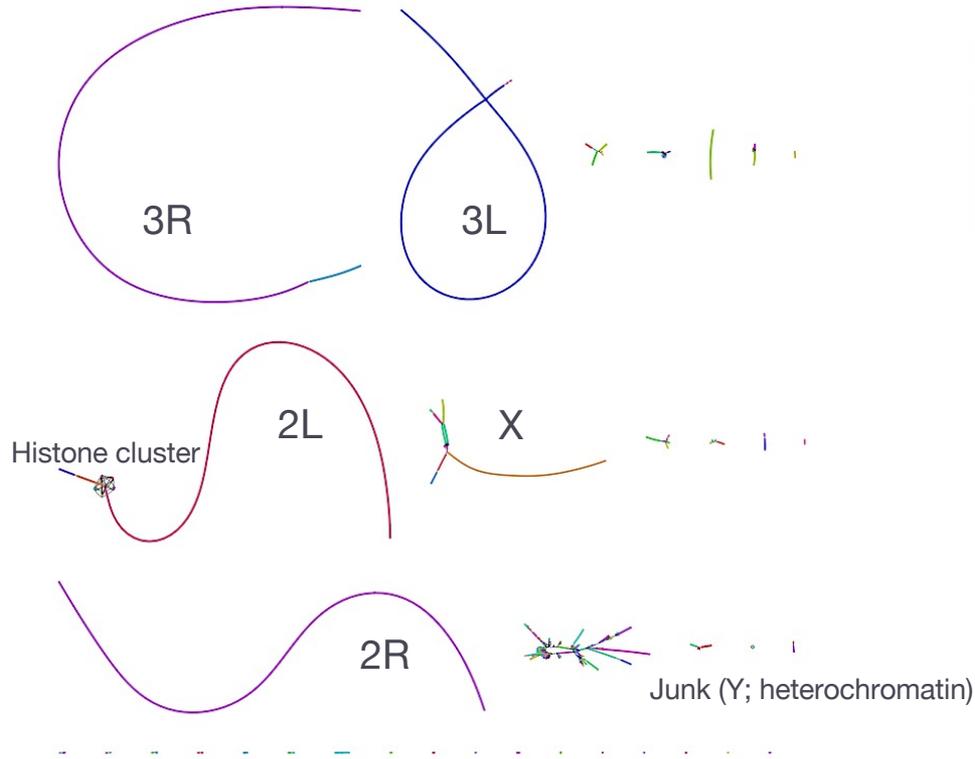
# Can you Canu?

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- ▶ Long read data is noisy
  - ▶ Base errors
  - ▶ Chimeric reads
  - ▶ *Solution*: read clustering, correction, and trimming
- ▶ Overlaps are long, and graph is big
  - ▶ All-pairs alignment is slow
  - ▶ Full graph is a giant tangle (due to repeats)
  - ▶ *Solution*: MinHash “best” overlap graph
- ▶ *D. melanogaster* results
  - ▶ Celera Assembler v8: **630,000** CPU hours, 15 Mbp NG50
  - ▶ Canu v1: **500** CPU hours, 21 Mbp NG50

# Complete *D. melanogaster* assembly

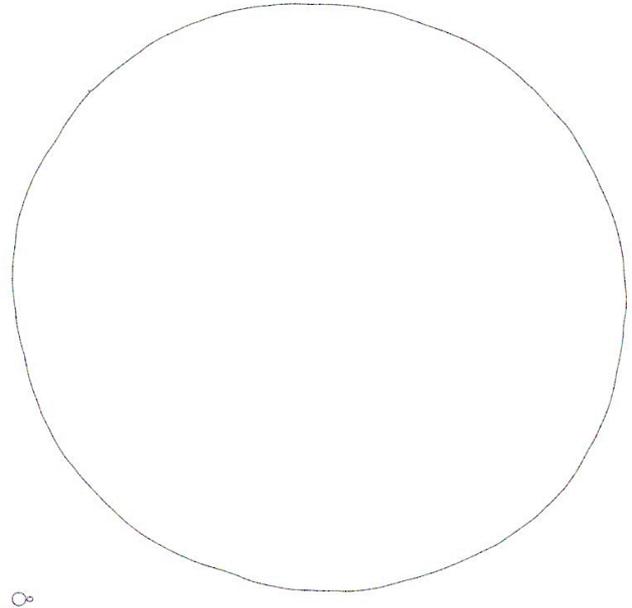


▶ **Assembling large genomes with single-molecule sequencing and locality-sensitive hashing.**  
Berlin et al. *Nature Biotechnology* (2015)

# Can long reads solve assembly?

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- ▶ 2012: Bacteria ( $10^6$  bp)
- ▶ 2014: Yeast ( $10^7$  bp)
- ▶ 2014: Drosophila ( $10^8$  bp)
- ▶ ?????: Human ( $10^9$  bp)

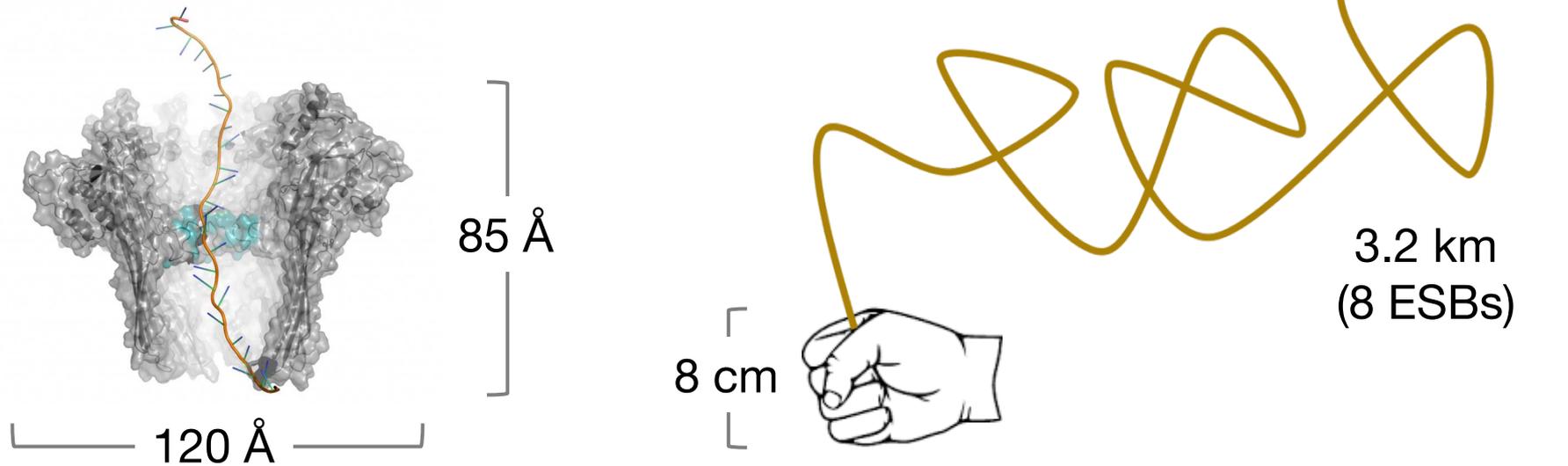




# Ultra-long reads

# Nanopore dimensions

- ▶ ONT R9 pore
  - ▶ Engineered *E. coli* CsgG membrane protein



▶ \*Assuming 3.4 Å per bp, 1 Mbp = 3,400,000 Å = 40,000x height of the pore

# Nanopore sequencing of human genomes

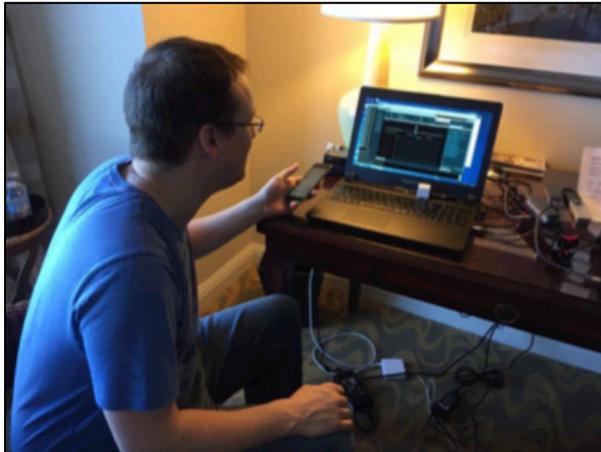
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## ▶ GM12878 Utah/Ceph

- ▶ 35x MinION R9.4
- ▶ 11 kb N50 read len
- ▶ 3 Mbp N50 contig len

## ▶ Clive Brown, ONT

- ▶ 60x MinION R9.4
- ▶ 19 kb N50 read len
- ▶ 30 Mbp N50 contig len

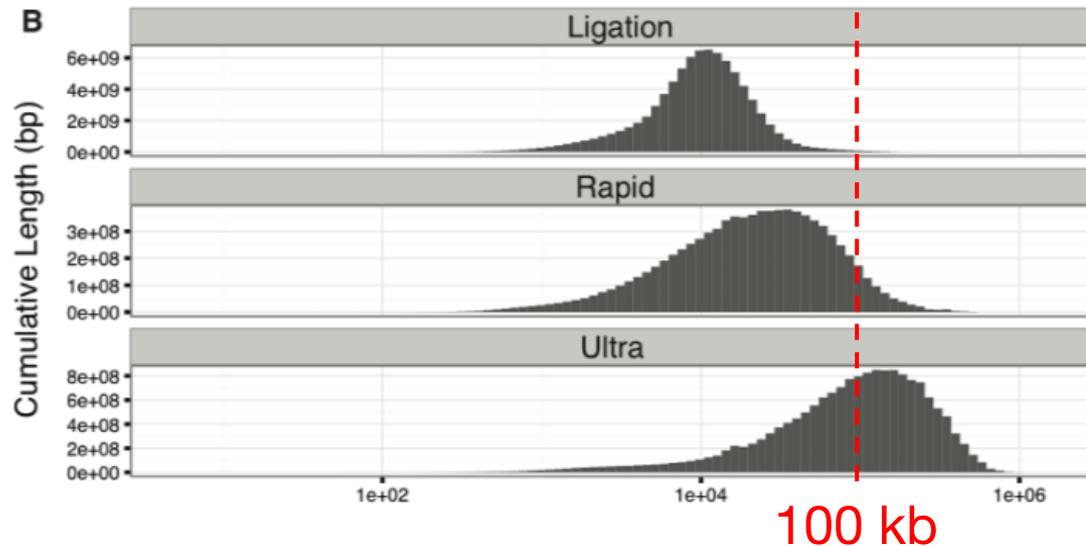


- ▶ **Nanopore sequencing and assembly of a human genome with ultra-long reads.**  
Jain et al. *Nature Biotechnology* (2018)

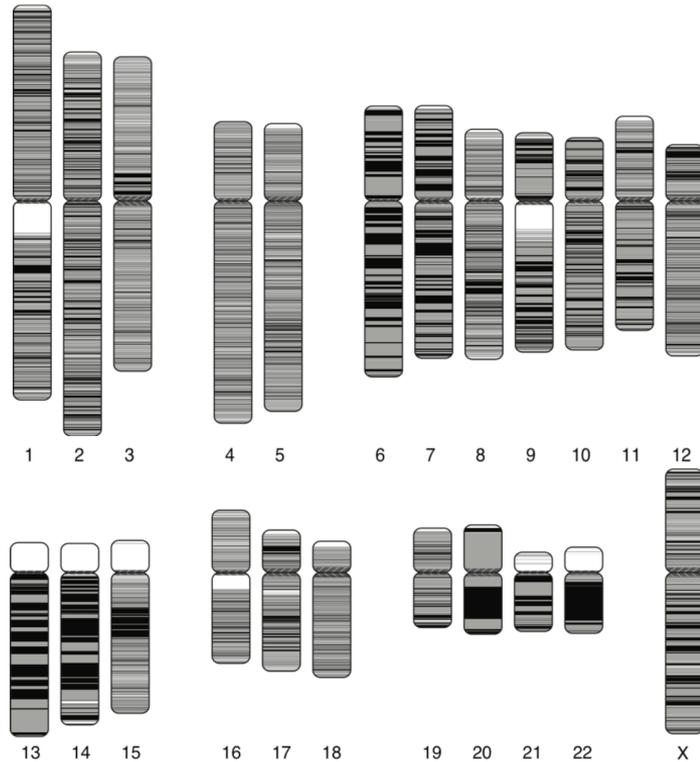
# Ultra-long reads



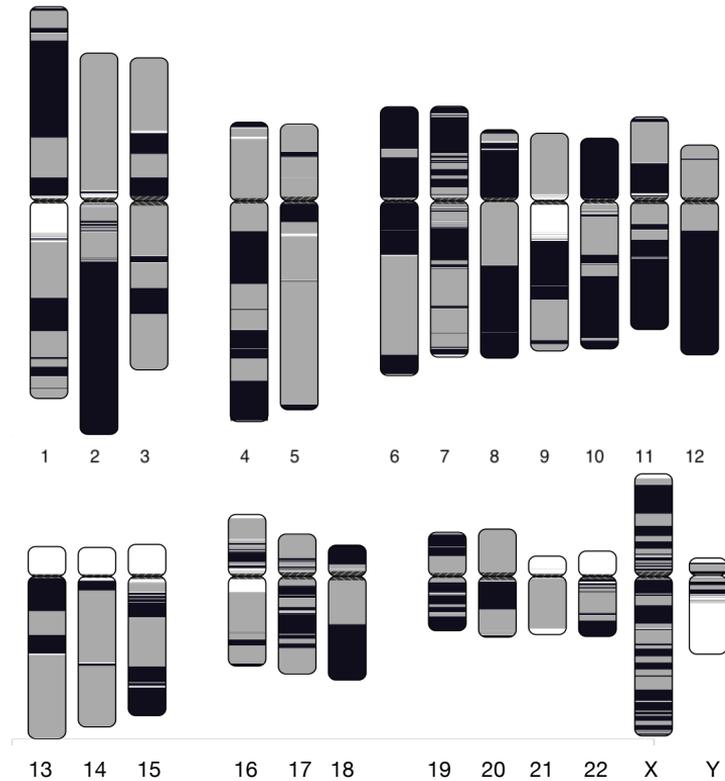
- ▶ 100 kb read N50, max close to 1 Mb!
  - ▶ Sambrook and Russel phenol-chloroform prep
  - ▶ Minimal pipetting, high input to rapid (transposase) kit



# Human genome, 2001



# Cliveome, 2017



▶ Cliveome 60x : NG50 29.5 Mbp



Not so fast...

Clive Brown is not an insect

# The perils

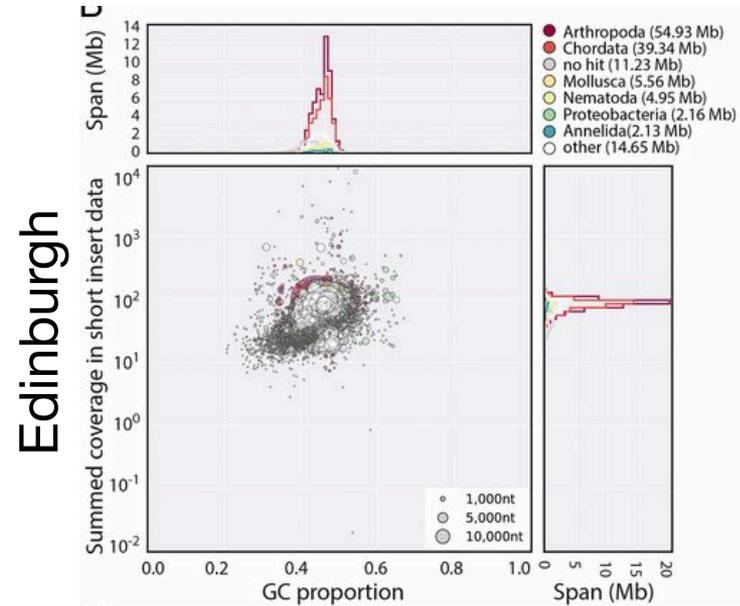
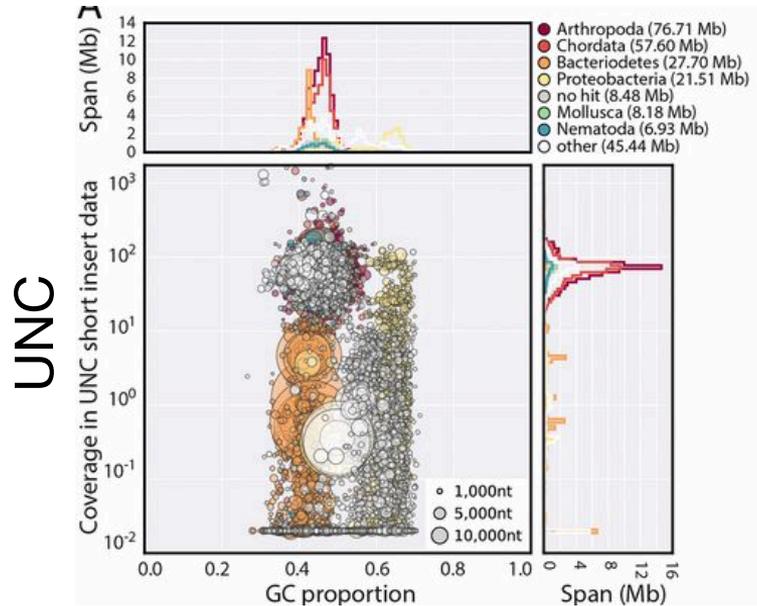
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- ▶ **Tiny bugs**
  - ▶ Can't sequence a single individual
  - ▶ Contamination risk
- ▶ **Repeats**
  - ▶ Every genome is different
- ▶ **Diversity**
  - ▶ A pot of bugs is a metagenome



# Contamination

## ► “Tardigate”



- **No evidence for extensive horizontal gene transfer in the genome of the tardigrade *Hypsibius dujardini*.**  
Koutsovoulos et al. *PNAS* (2016)

# Repeats

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- ▶ **Mealworm beetle**

- ▶ Brenda Oppert, USDA
- ▶ Why isn't Canu finishing?

- ▶ **Runaway satellite**

- ▶ 60% of genome is a 142 nt repeat
- ▶ Required adjusting Canu parameters for repeat weighting/screening



# Diversity

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- ▶ Heterozygous diploids
  - ▶ Some bugs hard to inbreed
  - ▶ Large populations, large diversity
- ▶ Grind up and sequence a pot of bugs
  - ▶ 100+ mosquitos
  - ▶  $\geq 2$  alleles at each locus?
  - ▶ Polymorphic inversions & integrations?

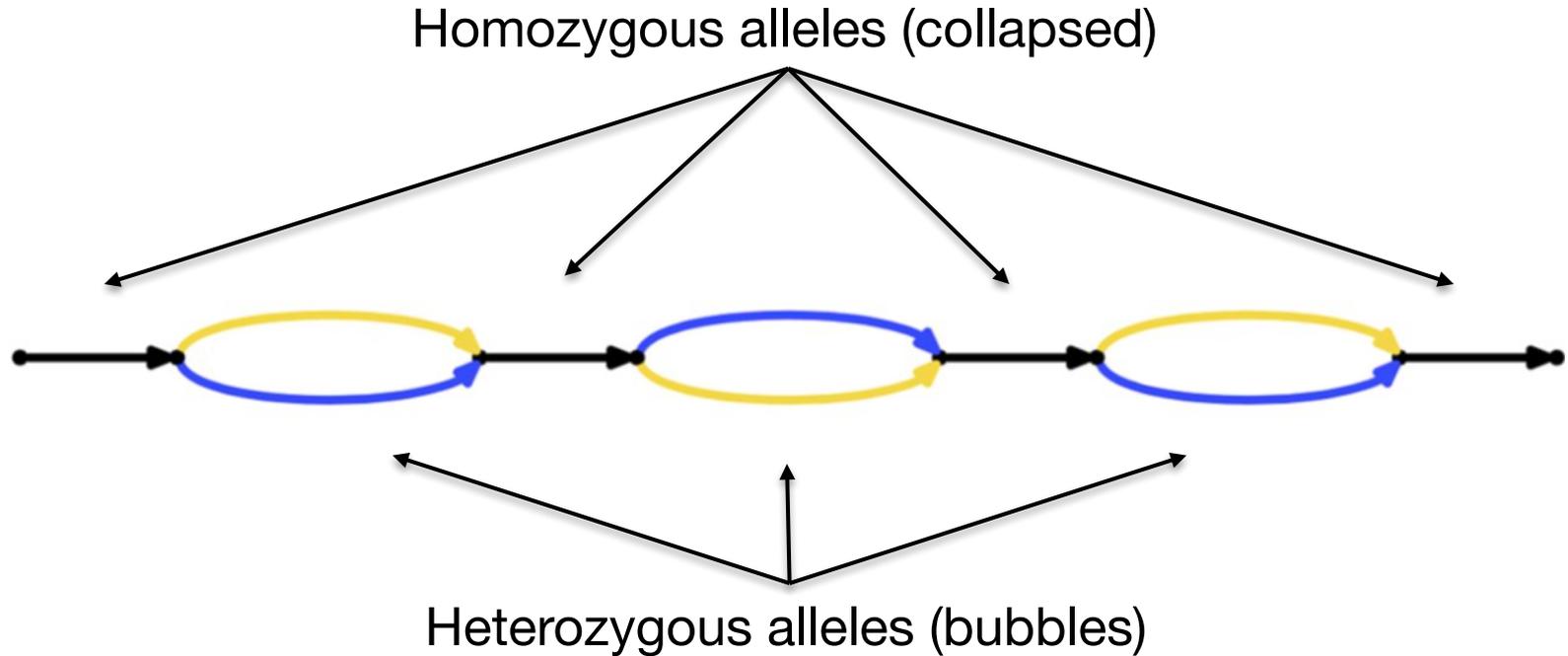


(c) Alex Wild

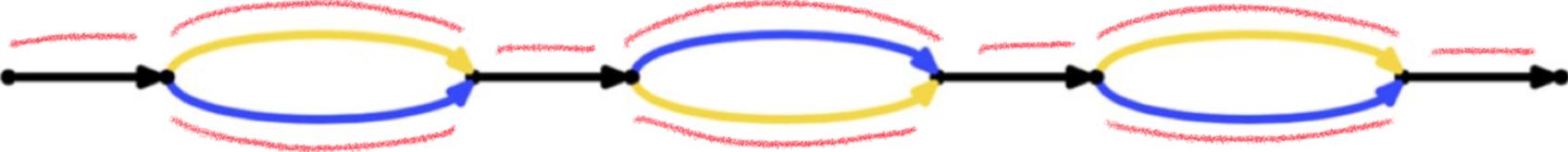
# Dealing with heterozygosity

# Diploid assembly graph

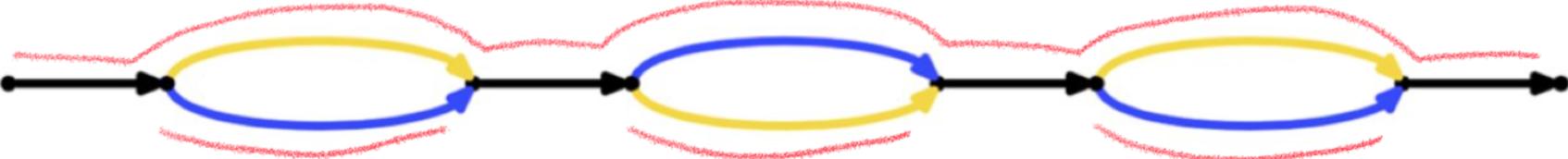
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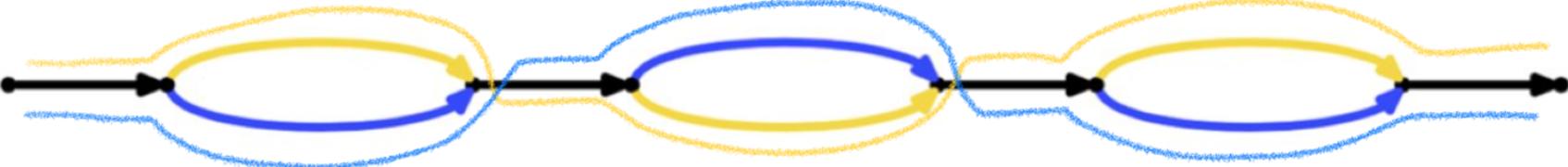
# Haplotigs



# Pseudo-haplotype + alts



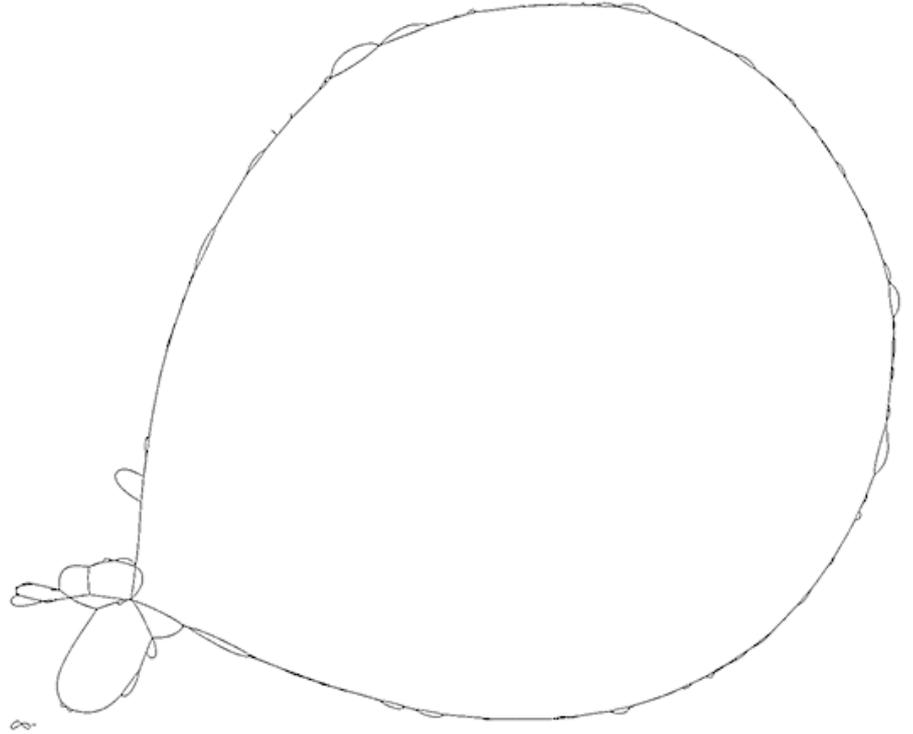
# Complete haplotypes



# Reality not so simple

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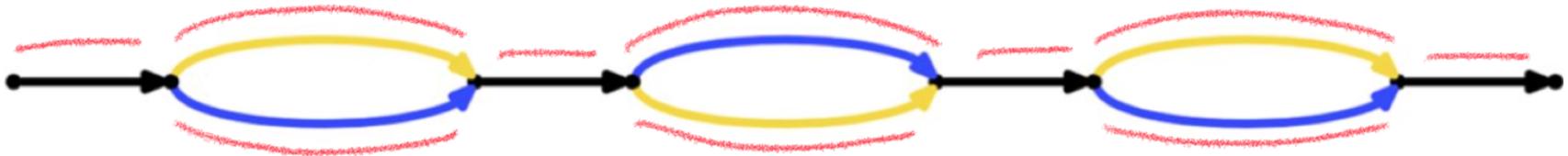
- ▶ Two *E. coli* strains
- ▶ Imagine now...
  - ▶  $N$  alleles mixed at different abundances
  - ▶ Plus, long high-copy repeat families



# *Aedes aegypti* example

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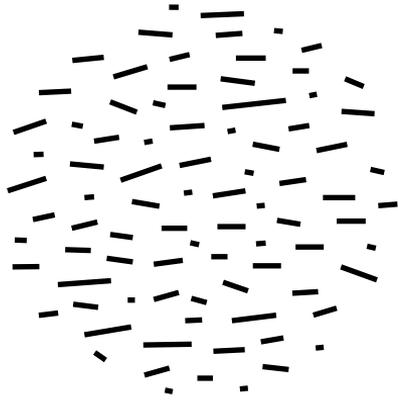
- ▶ Genome size ~1.3 Gbp
- ▶ Assembly size
  - ▶ FALCON-Unzip primary: 1.7 Gbp
  - ▶ FALCON-Unzip primary + alts: 2.0 Gbp
  - ▶ Canu: 2.8 Gbp
- ▶ “Deduplicated” with Hi-C and contig alignments



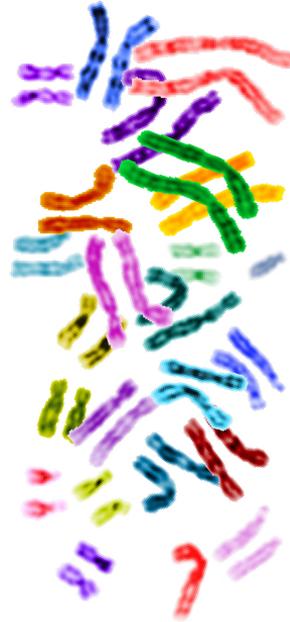
# De novo reference genomes

# Contigs $\neq$ Chromosomes

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$\neq$



# Scaffolding options

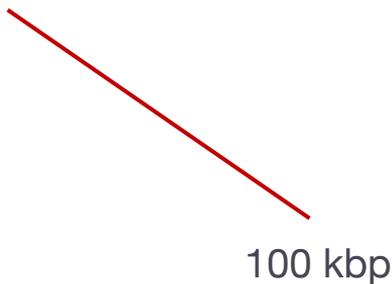
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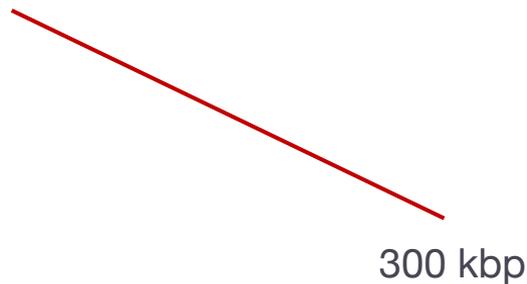
**Paired ends**



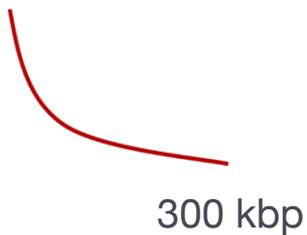
**10x Genomics**



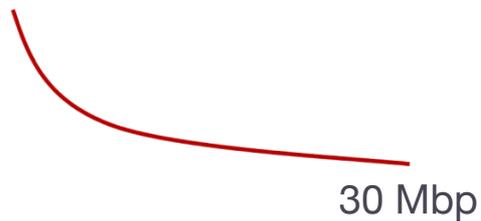
**BioNano\***



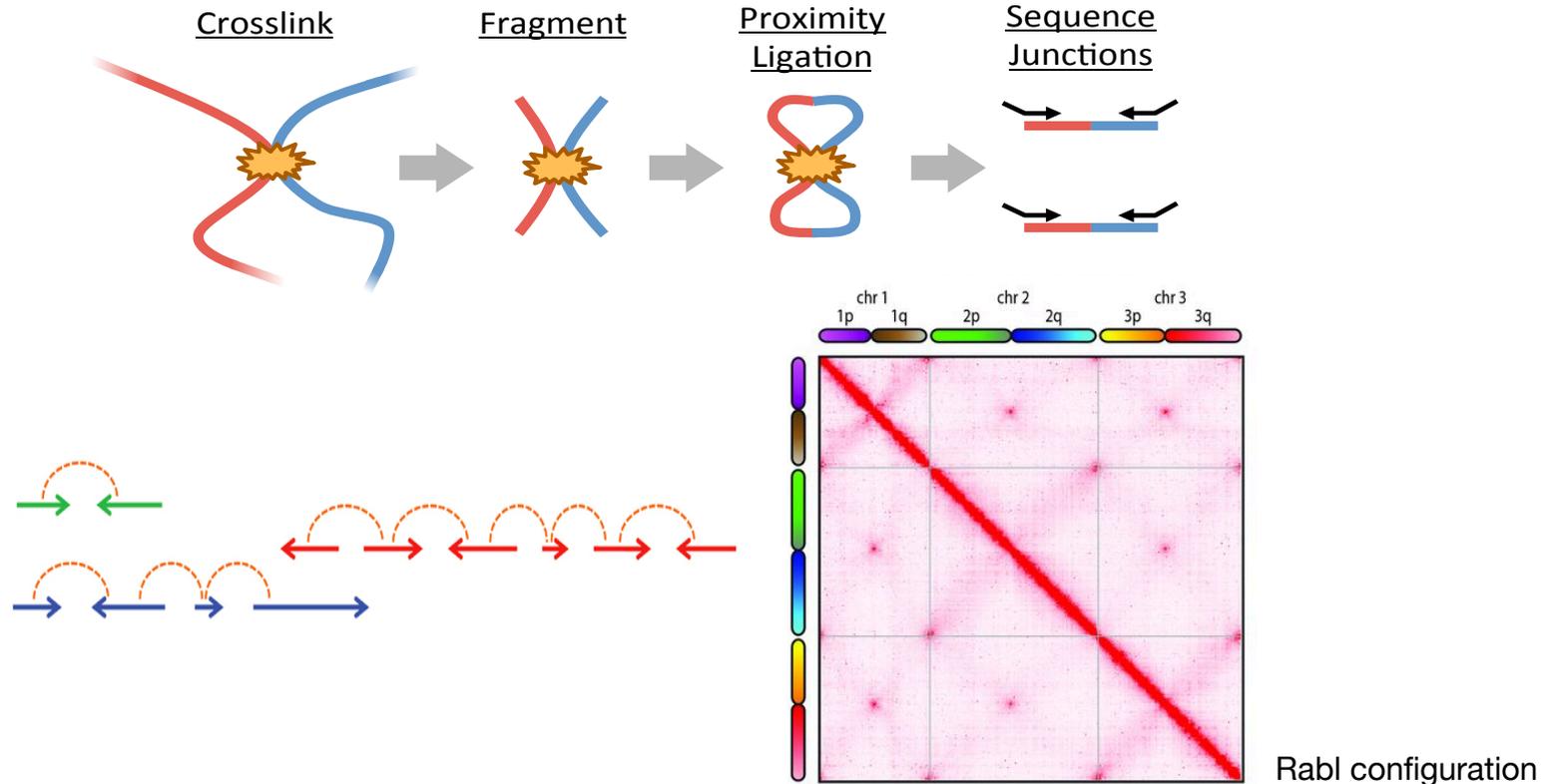
**Chicago**



**Hi-C**



# Hi-C chromatin conformation capture



# VGP ordinal sequencing recipe

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- ▶ Observations
  - ▶ PacBio : contigs
  - ▶ 10XG : scaffolds, phasing, and polishing
  - ▶ BioNano : scaffolds and validation
  - ▶ Hi-C: chromosome-scale scaffolds and phasing
  
- ▶ What's essential for reference genomes?
  - ▶ Start with long reads, add others as needed
  - ▶ Thorough validation
  - ▶ DO NOT ignore haplotype variation... (Korlach & Jarvis 2017)

# Scaffolding pseudo haplotypes is not fun

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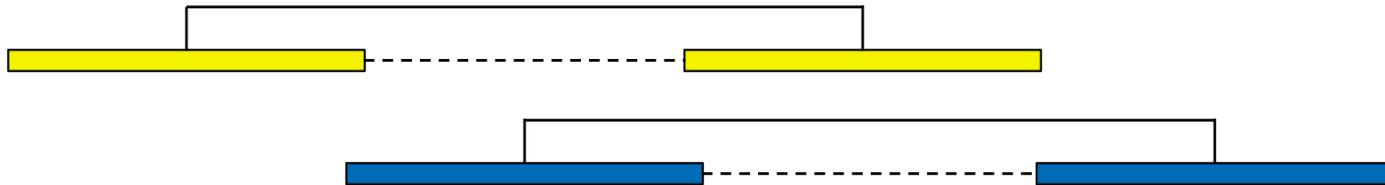
Pseudo-hap



Optical map

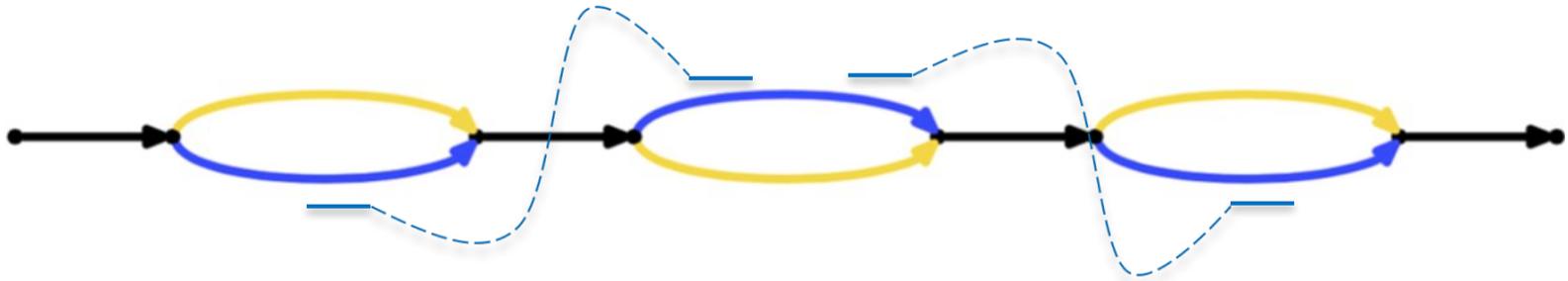


Scaffold interleaving

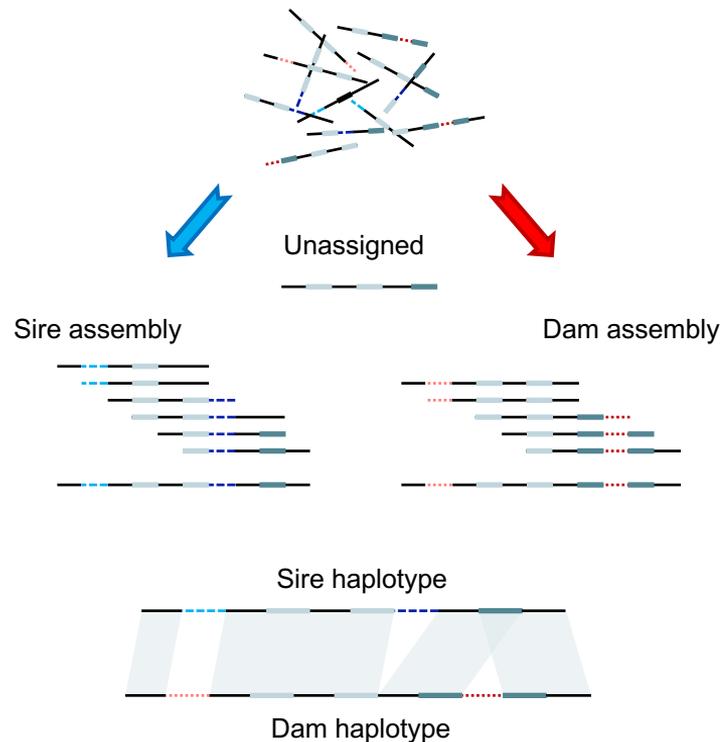
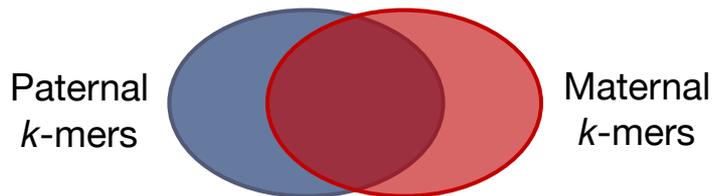
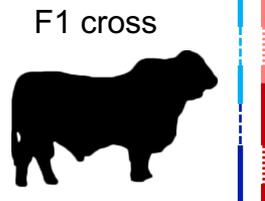
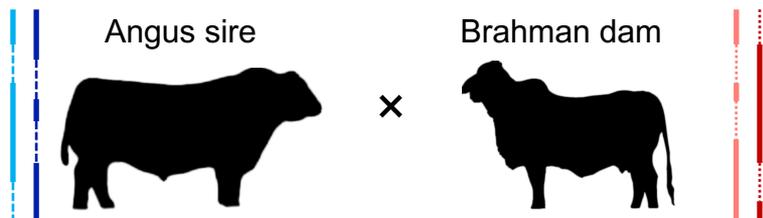
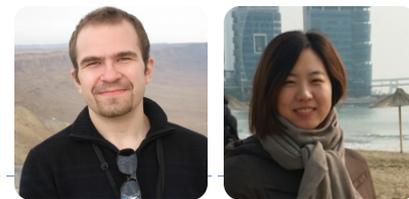


# Hard solution: scaffold the graph

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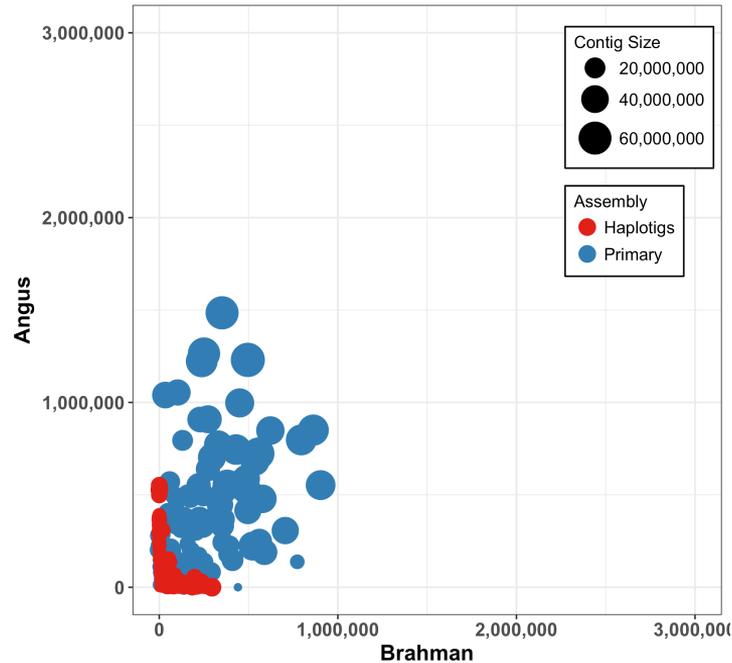


# Easy solution: trio binning

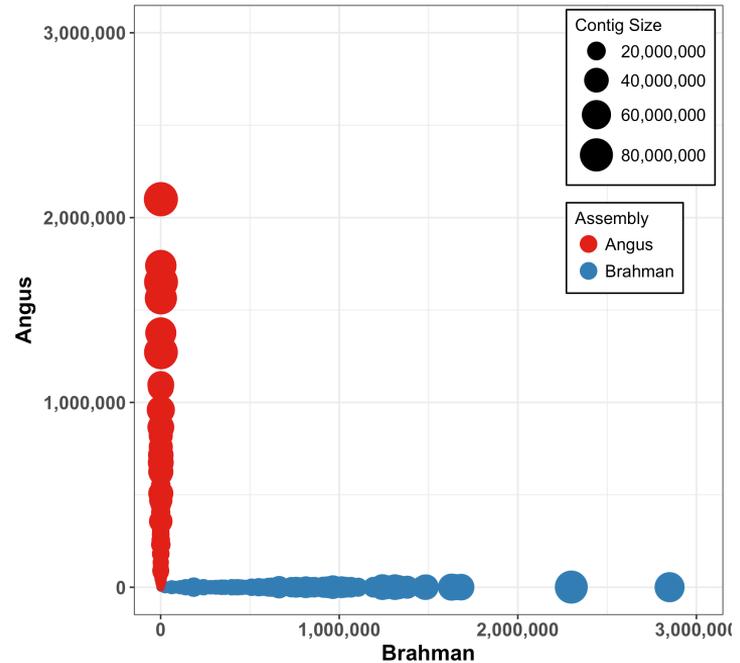


# Pseudo vs complete haplotypes

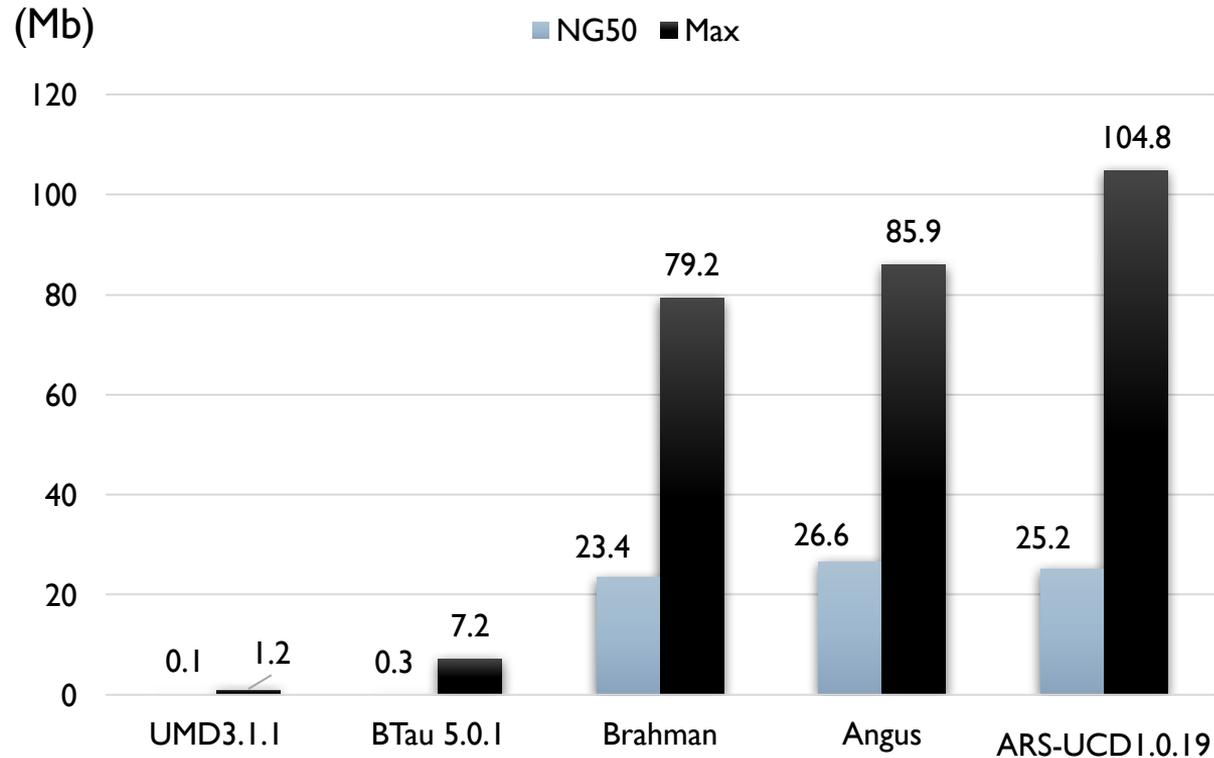
## ▶ FALCON-Unzip



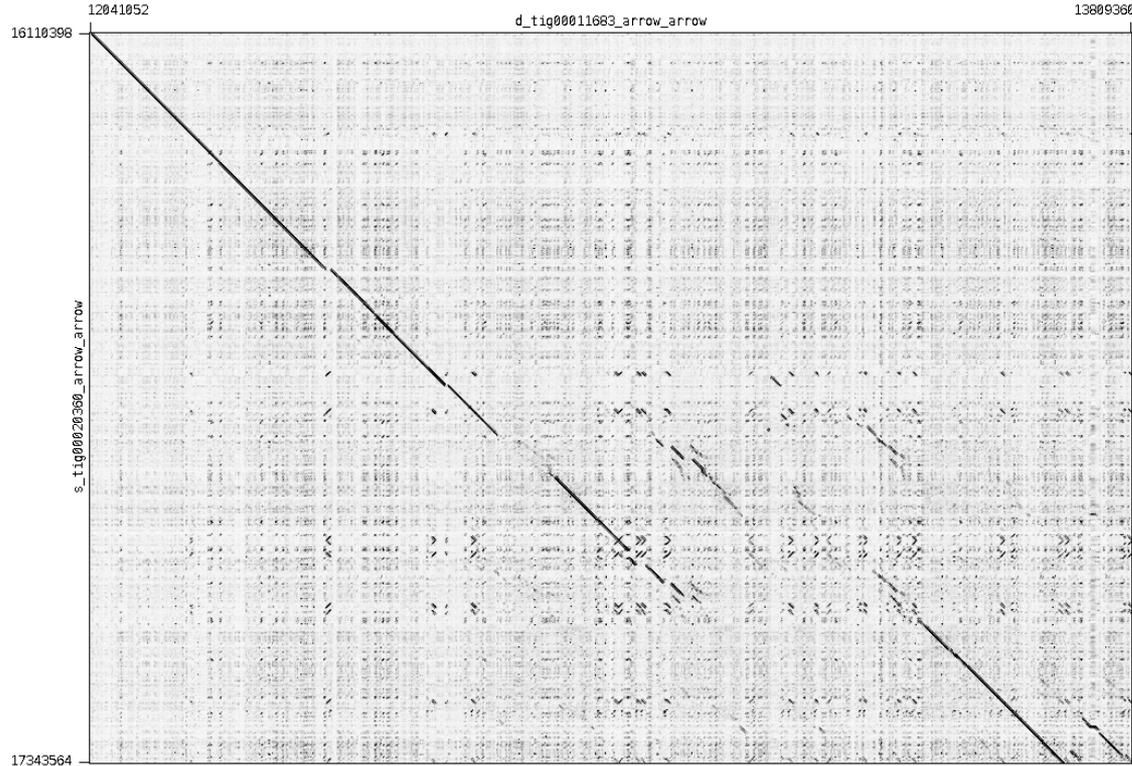
## ▶ TrioCanu



# Excellent continuity of both haplotypes

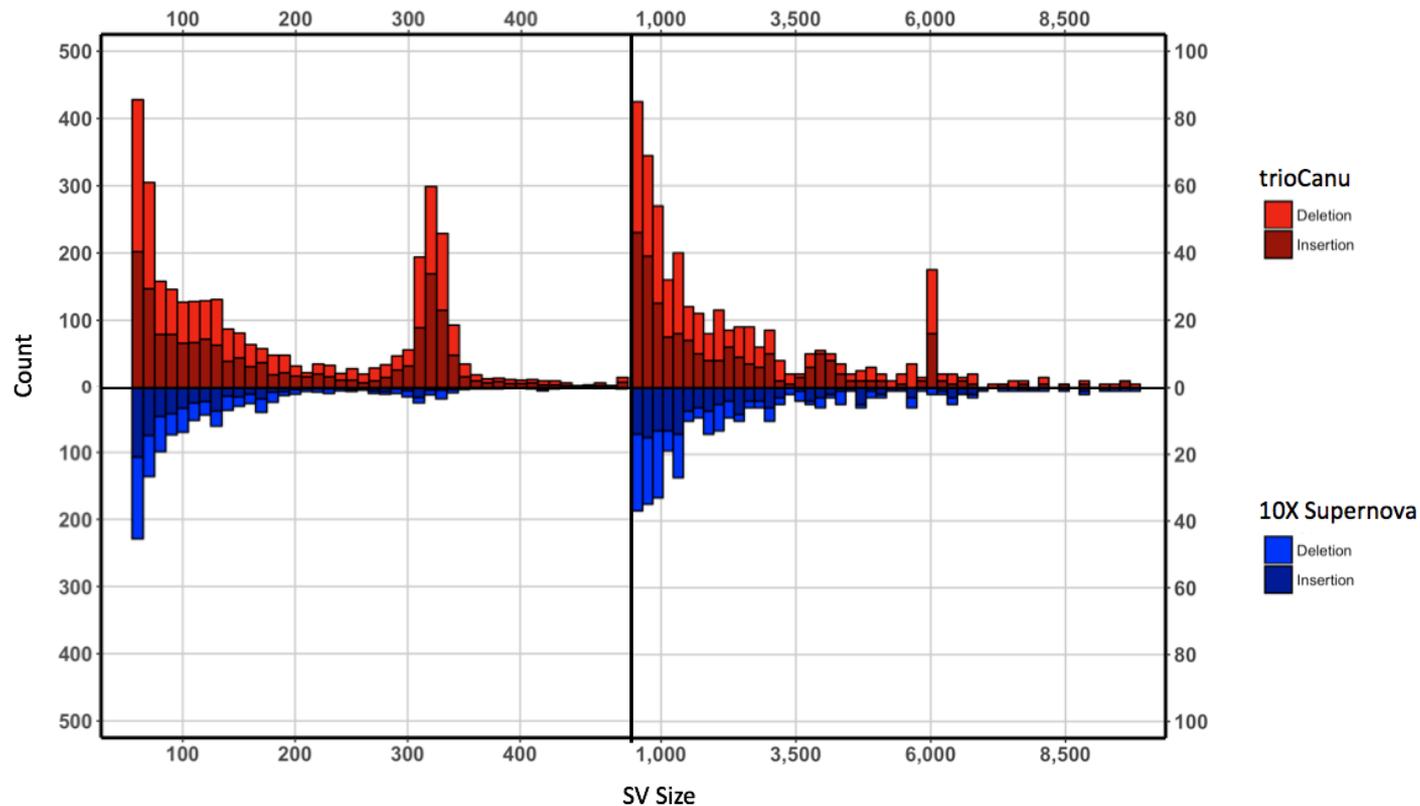


# Complex haplotype variation



- ▶ Y-axis: Angus paternal haplotype, X-axis: Brahman maternal haplotype (MHC class II)

# Short reads miss large variation

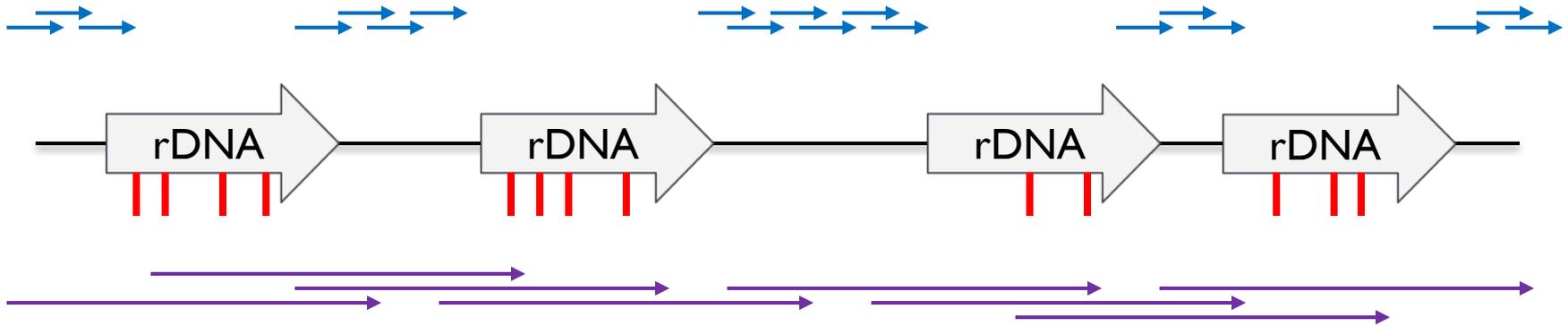


► Corrected phase block NG50: TrioCanu: 12.92 Mbp, 10x: 4.26 Mbp

# Long read polishing is essential

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- ▶ Cannot map short reads to repeats and errors
  - ▶ Therefore, cannot polish/assemble repeats with short reads
  - ▶ Long read assemblies more accurate in repeats
  - ▶ Beware of haplotype variation



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- ▶ In some regions, short-read polishing can actually harm the assembly

All assemblies are wrong,  
some are useful

# Tools

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- ▶ Long-read assembly
  - ▶ FALCON-Unzip, **Canu**, Flye, wtdbg
- ▶ Scaffolding
  - ▶ **Salsa**, 3D-DNA, HiRise\*, Scaff10x, ARCS, BioNano
- ▶ Polishing
  - ▶ Quiver/Arrow, Nanopolish\*, FreeBayes, Pilon, PBJelly\*
- ▶ QC & Validation
  - ▶ BioNano, BUSCO, **Mash**, BlobTools, Juicebox
  - ▶ GenomeScope, KAT, Assemblytics, IGV

# Summary

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- ▶ *Haploid* assembly is solved by long reads
  - ▶ But most sequencing samples are not haploid
- ▶ Reads will get longer and cheaper
  - ▶ Nanopore promising, but behind in consensus quality
- ▶ Remaining assembly challenges
  - ▶ **Complete haplotype recovery**
  - ▶ Diploids, polyploids, and populations
  - ▶ Heterochromatin and large duplications
  - ▶ New representations and tools



# Acknowledgements

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[genomeinformatics.github.io](https://genomeinformatics.github.io)

- ▶ Sergey Koren
- ▶ Brian Walenz
- ▶ Alexander Dilthey
- ▶ Arang Rhie
- ▶ Jay Ghurye



AD



JG



CJ



SK



BO



AP



AR



AS



BW

