



## 1. Introduction

Genome assembly

: Process of reconstructing genomes for DNA sequence reads

Single molecule sequencing (SMS)



Genome assembly

Single molecule seuqencing(SMS)

: Using short-read technologies (Illumina), using long-read technologies (Pacific Biosciences & Oxford Nanopore)

Genome assembly approach: 'The de Bruijn graph'



'Flye(assembly of long, error-prone reads using repeat graphs)'



#### Comparison of Single molecule seugencing (SMS) platforms

: Long-read sequencing technologies can produce much more longer reads. But drawback is the relatively high error rate.

	NS	PacBio	Illumina	Ion Torrent
Read	Variable (200 bp up to	Up to	Up to 600 bp	Up to 400
length	2 Mbps)	20 kb	(2x300 PE)	bp (SE)
SNV error rate	1%–5%	0.1%*	<0.1%	<0.1%
Indel error rate	5%–10%	4%*	<0.1%	1%

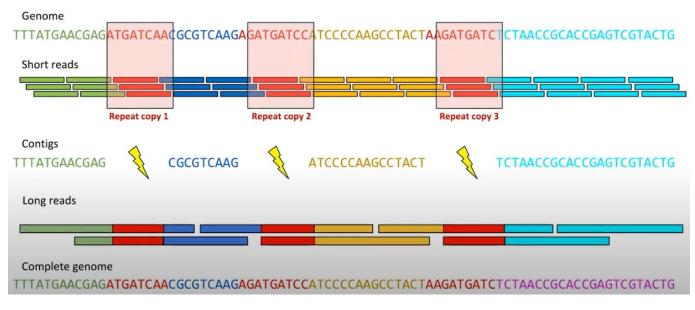
PE, pair-end; SE, single-end; \*Error-rate estimation of PacBio circular consensus sequencing (CCS) method.

⟨ Error-rate comparison of NS, PacBio, Ilumina, and Ion Torrent sequencing platforms⟩



- Challenges for genome assembly
  - SMS short-read assembly

: In repetitive regions of the genome, accurately assembling short reads is challenging



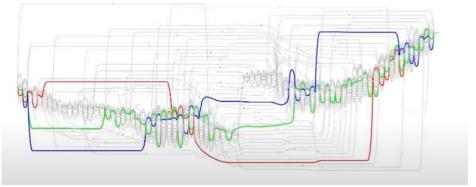
\( Assemblies can be fragmented \)

<sup>&</sup>quot;Flye and metaFlye: algorithmsa for long-read de novo assembly using repeat graphs", Oxford Nanopore technologies



#### - The de Bruijn graph approach assembly

Due to long-read sequencing error rate, how to deal with fragmented de Bruijn graph and how to transform it into an assembly graph is challenging

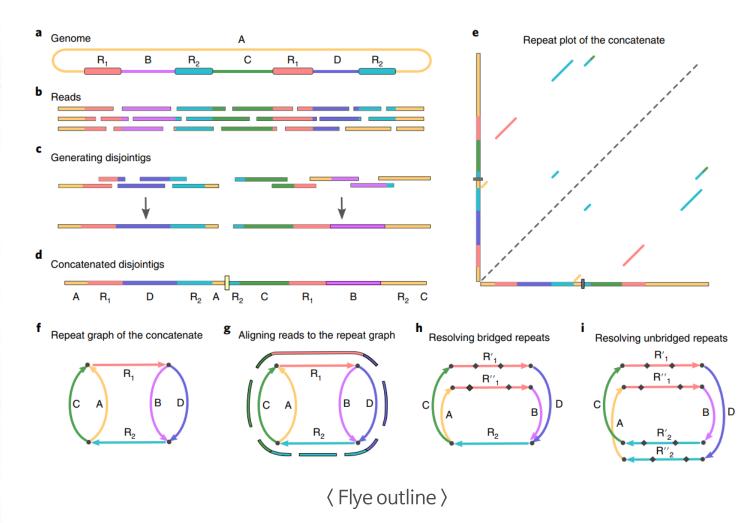


⟨ Transformation of de Bruijn graph into an assembly graph⟩

Very complicated and time consuming!!



### Flye outline





• A 'genome' with two 99% identical copies of a repeat R1 and two 99% identical copies of a repeat R2. Segments A, B, C, and D represent non-repetitive regions.

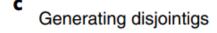


A set of reads from the genome.





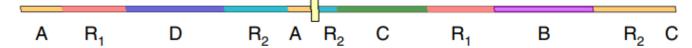
 Two (misassembled) disjointigs AR1DR2A and R2CR1BR2C derived from the reads.





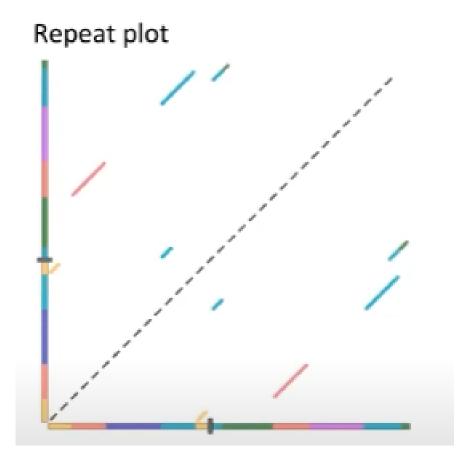
• Concatenate of the disjointigs.

# **d**Concatenated disjointigs



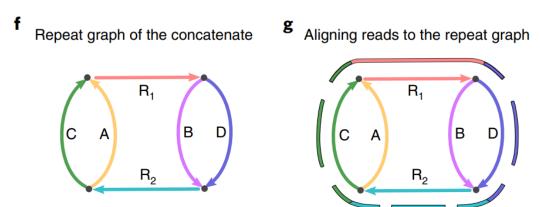


• Repeat plot of the concatenate.

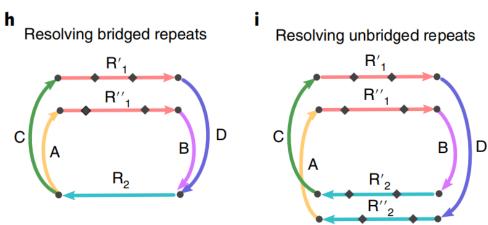




 Repeat graph constructed by gluing vertices in the concatenate according to the repeat plot. Aligning reads against the repeat graph.

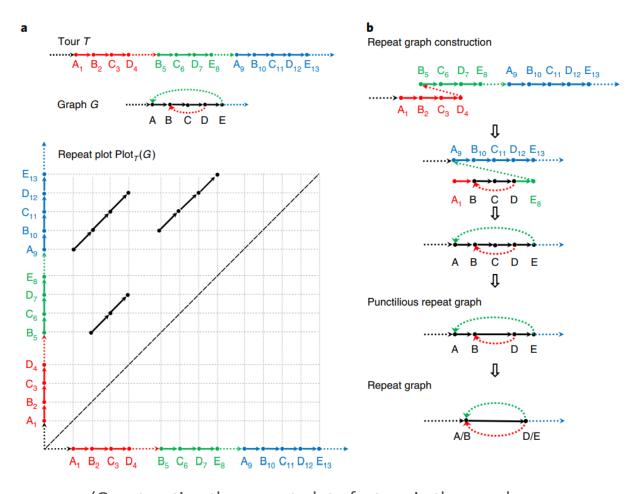


Resolving the bridged repeat R1 and reconstructing its two copies R'1
and R''1. Resolving the unbridged repeat R2 with two slightly diverged
copies.





#### Theoretical framework for the repeat graph construction



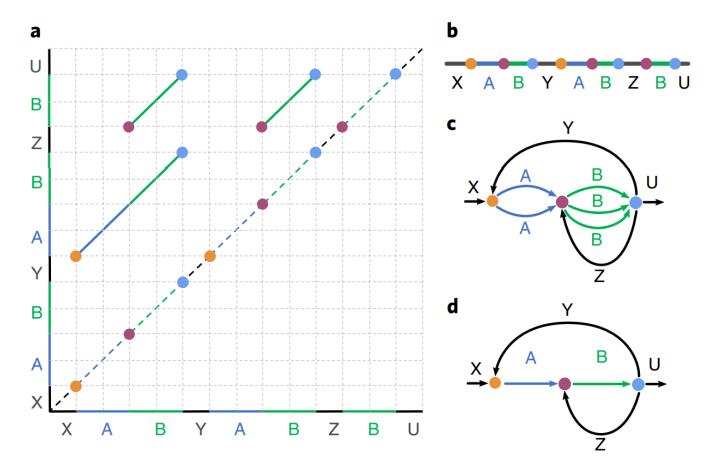
(Constructing the repeat plot of a tour in the graph and constructing the repeat graph from a repeat plot)



# 2. Results

#### Repeat graph construction

: Repeat graph compactly represents all repeats in a genome and reveals their mosaic structure

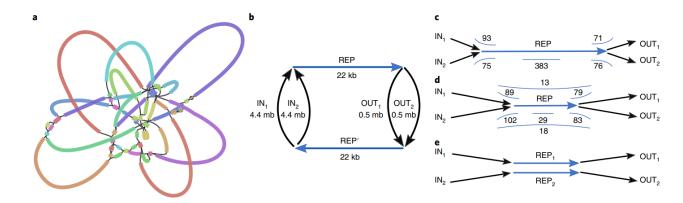


Constructing the approximate repeat graph from local self-alignments



#### Resolving unbridged repeats with Flye

: Flye utilizes the constructed repeat graph for the resolution of unbridged repeats. The repeat graph constructed by Flye offers an approach for resolving unbridged repeats based on analyzing the topology of the repeat graph.



(Resolving an unbridged repeat)



#### Benchmarking with the YEAST dataset

Dataset	Assembler	Length (Mb)	No. contigs	NG50 (kb)	Reference coverage (%)	Reference percentage identity (%)	No. misassemblies	NGA50 (kb)
YEAST-PacBio	Flye	12.1	28	670	98.3	99.95	5	560
	Canu	12.4	33	708	99.5	99.95	13	603
	Falcon	12.1	42	562	97.5	99.81	27	562
	HINGE	12.2	45	440	91.9	98.81	19	361
	Miniasm + ABruijn	12.2	36	600	98.2	99.93	11	592
YEAST-ONT	Flye	12.1	28	810	98.7	99.04	9	660
	Canu	12.2	41	800	99.1	98.96	18	655
	Falcon	11.9	41	662	97.4	98.81	17	637
	HINGE	12.2	64	309	92.5	97.94	59	292
	Miniasm + ABruijn	11.6	24	723	98.8	99.03	12	723

- The YEAST dataset contains PacBio and Oxford Nanopore Technology (ONT) reads from the *Saccharomyces cerevisiae* S288c genome of length 12.1Mb at 30×coverage.



#### Analyzing the WORM dataset

Dataset	Assembler	Length (Mb)	No. contigs	NG50 (kb)	Reference coverage (%)	Reference percentage identity (%)	No. misassemblies	NGA50 (kb)
WORM	Flye	103	85	3,256	99.5	99.93	111	1,893
	Canu	108	175	2,954	99.7	99.93	190	1,974
	Falcon	101	106	2,291	98.7	99.78	118	1,242
	HINGE	103	64	2,710	98.0	99.40	174	1,441
	Miniasm + ABruijn	108	178	2,314	99.6	99.93	181	1,437

-The WORM dataset contains PacBio reads from the Caenorhabditis elegans genome of length  $\sim$  100Mb at 40× coverage.



#### Analyzing the HUMAN and HUMAN+ datasets

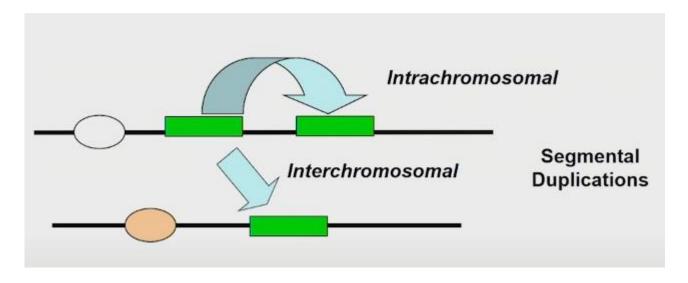
Dataset	Assembler	Length (Mb)	No. contigs	NG50 (kb)	Reference coverage (%)	Reference percentage identity (%)	No. misassemblies	NGA50 (kb)
HUMAN	Flye + Pilon	2,776	1,069	7,886	96.4	99.70	879	6,349
	Canu + Pilon	2,730	2,195	3,209	95.4	99.49	1,200	2,870
	MaSuRCA	2,768	1,269	4,670	95.1	99.84	1,500	3,812
HUMAN+	Flye + Pilon	2,823	782	18,181	97.0	99.69	1,487	11,800
	Canu + Pilon	2,815	798	10,410	96.8	99.81	1,455	7,007
	MaSuRCA	2,876	1,111	8,425	97.5	99.80	2,101	5,581

- The HUMAN dataset contains ONT reads from the GM12878 human cell line at  $30 \times$  coverage complemented by a set of short Illumina reads at  $50 \times$  coverage.
- The HUMAN+ dataset combines the HUMAN dataset with a dataset of ultra-long ONT reads (those with reads N50 $\rangle$ 100 kb; that is, 50% of the total sequence data in reads longer than 100 kb) at 5 $\times$  coverage.



#### Complex mosaic structure of segmental duplication (SD)

: SDs are long DNA sequences (typically defined as being ) 1kb in length) that have nearly identical sequences (90–100%) and exist in multiple locations as a result of duplication events. (tandem or interspersed & interchromosomal or intrachromosomal)

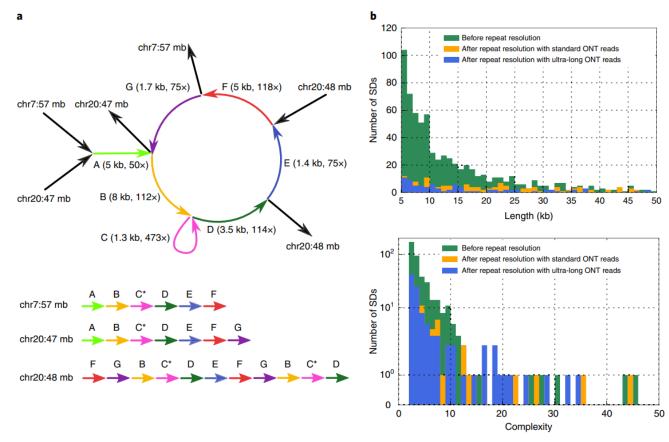


(Simple image showing Segmental Duplication)



#### SDs in the human genome

: The repeat graph constructed by Flye reveals the complex mosaic structure of SDs.

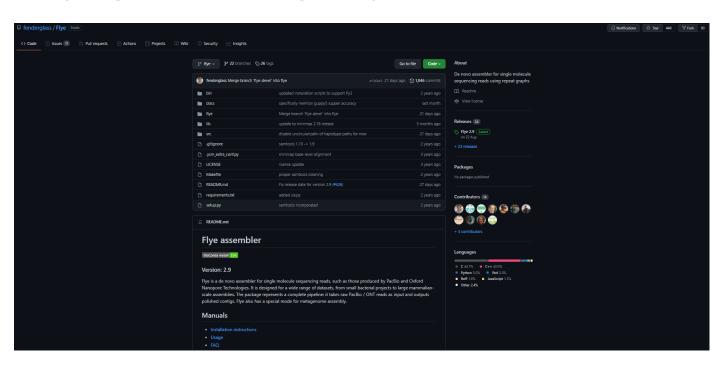


(An SD from the Flye assembly of the HUMAN dataset and the distribution of the lengths and complexities of all SDs from the same assembly)



# 3. Github: Flye assembler

https://github.com/fenderglass/Flye



(Github: Flye assembler)



#### Flye assembler input & parameters

Input reads can be in FASTA or FASTQ format, uncompressed or compressed with gz. Currently, PacBio (raw, corrected, HiFi) and ONT reads (raw, corrected) are supported.

(Flye short manual)



#### Flye assembler output

- assembly.fasta
- : Final assembly. Contains contigs and possibly scaffolds.
- assembly\_graph. {gfa | gv}
- : Final repeat graph. Note that the edge sequences might be different (shorter) than contig sequences, because contigs might include multiple graph edges.
- assembly\_info.txt : Extra information about contigs (such as length or coverage)

```
#seq_name length cov. circ. repeat mult. alt_group graph_path
contig 1 2237555 105 Y N 1 * 1
```

⟨assembly\_info.txt of Bifidobacterium bifidum⟩

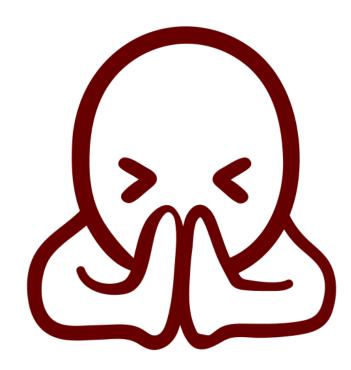


## 4. Discussion

- Flye algorithms for constructing an assembly graph from sequencing reads and repeat characterization improves the genome assembly.
- Benchmarking flye against five state-of-the-art assemblers and show that it generates better or comparable assembles, while being an order of magnitude faster.
- Flye algorithm for resolving unbridged repeats resolved only a small fraction of various long SDs since it is currently limited to simple SDs. Moreover it currently has difficulties resolving highly similar SDs (SDs with less than 1% divergence).



5. Q & A



Thank You for listening Any Questions?