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# Complete telomere-to-telomere de novo assembly of the Plasmodium falciparum genome using long-read sequencing

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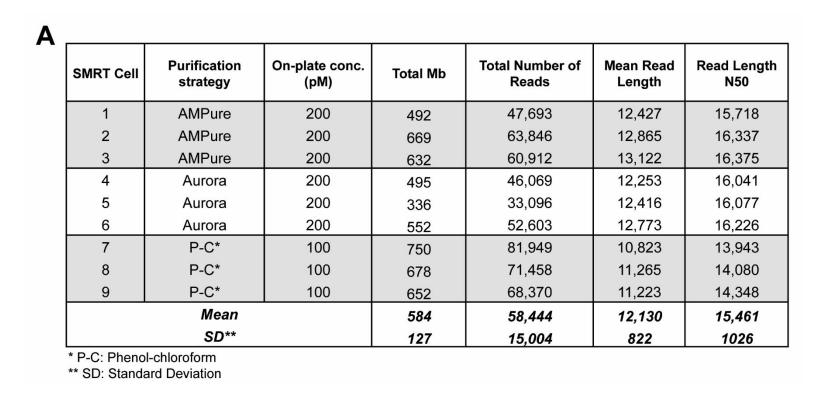
### Abstract

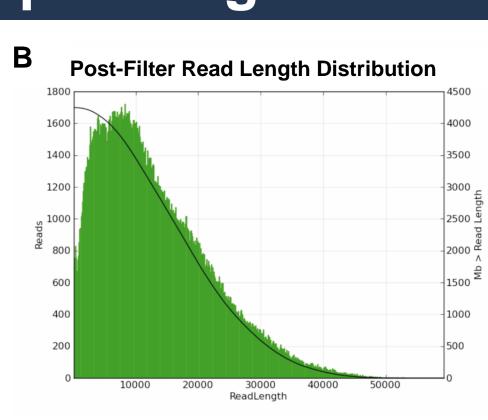
Sequence-based estimation of genetic diversity of *Plasmodium falciparum*, the most lethal malarial parasite, has proved challenging due to a lack of a complete genomic assembly. The skewed AT-richness (~80.6% (A+T)) of its genome and the lack of technology to assemble highly polymorphic sub-telomeric regions that contain clonally variant, multigene virulence families (i.e. *var* and *rifin*) have confounded attempts using short-read NGS technologies.

Using Single Molecule, Real-Time (SMRT) Sequencing, we successfully compiled all 14 nuclear chromosomes of the *P. falciparum* genome from telomere-to-telomere. A Hierarchical Genome Assembly Process (HGAP) was used to *de novo* assemble the *P. falciparum* genome.

This assembly accurately resolved centromeres (~90-99% (A+T)) and sub-telomeric regions, and identified large insertions and duplications in this genome that added extra genes in the *var* and *rifin* virulence families, along with smaller structural variants such as homopolymer tract expansions. Identifying the polymorphic and repetitive sub-telomeric sequences of parasite populations from endemic areas might inform the link between structural variation and phenotypes such as virulence, drug resistance and disease transmission.

### Sample Preparation And Sequencing





### Table 1 / Figure 1. P. falciparum SMRTbell library preparation using three genomic DNA purification methods

High-molecular weight *P. falciparum* genomic DNA was purified in triplicate using three different methods (i) AMPure PB magnetic beadbased clean up, (ii) electrophoretic DNA extraction using the Aurora System, or phenol-chloroform extraction. Following a standard 20 kb SMRTbell library construction protocol with a 15 kb cut-off size selection, samples were sequenced on the PacBio RS II using 4 hour movies. Library size, quantity, and quality before and after size selection (data not shown) and (A) individual SMRT Cell analysis results were similar, so further analysis utilized pooled sequence data from all 9 SMRT Cells. (B) Post-filtering read length distribution. The X-axis is read length, while the Y-axes is number of reads (green columns) and megabases (Mb) greater than read length (curve). HGAP was set to use the longest 30-fold coverage of subreads for preassembly, in this case subreads longer than 23,278 bases.

### REFERENCES

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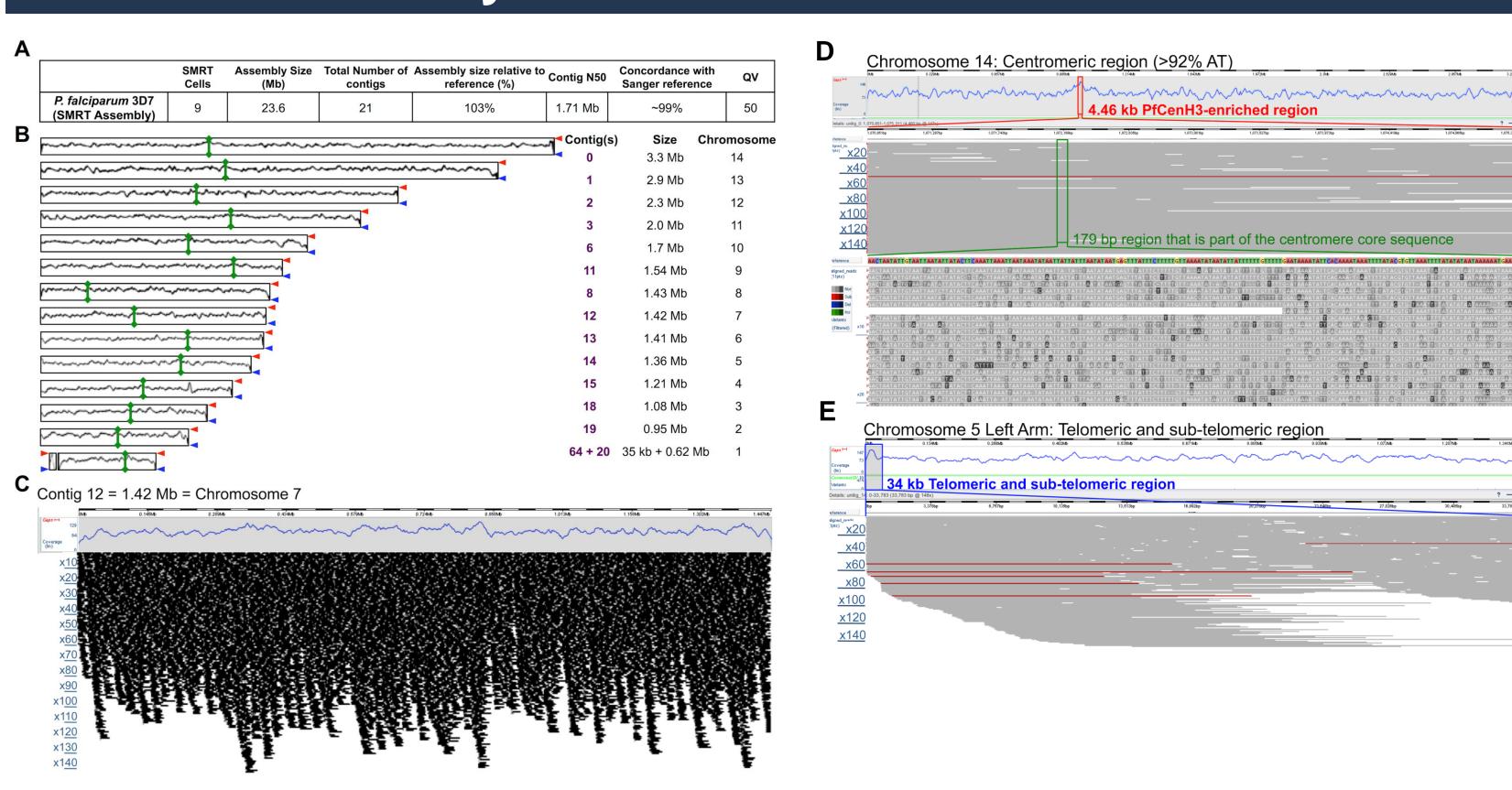
# **Assembly Comparison**

	SANGER SEQUENCING <sup>2</sup>		ILLUMINA SEQUENCING <sup>3</sup>		454 SEQUENCING <sup>4</sup>		SMRT SEQUENCING (THIS STUDY)
Parasite strain	Dd2	HB3	NP-3D7-S	NP-3D7	7C126	SC05	3D7
Read length (bases)	600-700		36	76	3,000 (Paired end)		12,130
# of contigs	4,511	2,971	26,920	22,839	9,452	9,597	21
N50 Contig Size (kb)	11.6	20.6	1.5	1.6	3.3	3.3	1,710
Largest Contig (kb)	79.2	111.9	29.1	24.0	36.7	34.4	3,290
# of assembled bases (Mb)	19.5	23.4	19.0	21.1	20.8	21.1	23.6
Average Coverage	7.8-fold	7.1-fold	43-fold	64-fold	33-fold	36-fold	94-fold

#### Table 2. Comparison of previous *P. falciparum* 3D7 *de novo* assemblies using other sequencing technologies

Due to short read lengths and difficulties with high AT bias, other PCR-based sequencing technologies struggle to assemble contigs even as long as the mean raw reads used in this work. In contrast, this SMRT Assembly results in a nearly finished genome with a contig N50 that is itself a full chromosome and two to three orders of magnitude larger than what was possible with other sequencing approaches.

## **Assembly Produced Full Chromosomes**



### Figure 3. HGAP de novo assembly resolves all 14 P. falciparum chromosomes

(A) *P. falciparum* genome HGAP assembly summary metrics. (B) All fourteen *P. falciparum* chromosomes were assembled end-to-end, except for the left arm of chr. 1 which assembled as separate contig of 0.35 kb. The contig name in the SMRT assembly, its size, the corresponding chromosome and its coverage are indicated. The scale of coverage is between 0 (blue arrowhead) and 150-fold (red arrowhead) except for contig 64, where the scale is from 0-100. The centromere position in each contig is indicated with the green line. (C) Contig 12 of the SMRT assembly, which aligns to chr. 7, and its raw read coverage (black). (D) The depth of coverage of the ~4.5 kb PfCenH3-occupied region of chromosome 14, which averages 92% (A+T). The raw sequences obtained for a 176 bp fragment of the core centromere are shown. Colors: A = red, T = green, G = yellow and C = blue. (E) Depth of coverage of the ~34.6 kb telomeric/subtelomeric region of chromosome 5. Gray reads are of high mapping quality, while red indicates a low mapping quality.

## Identification of Large Genomic Variants

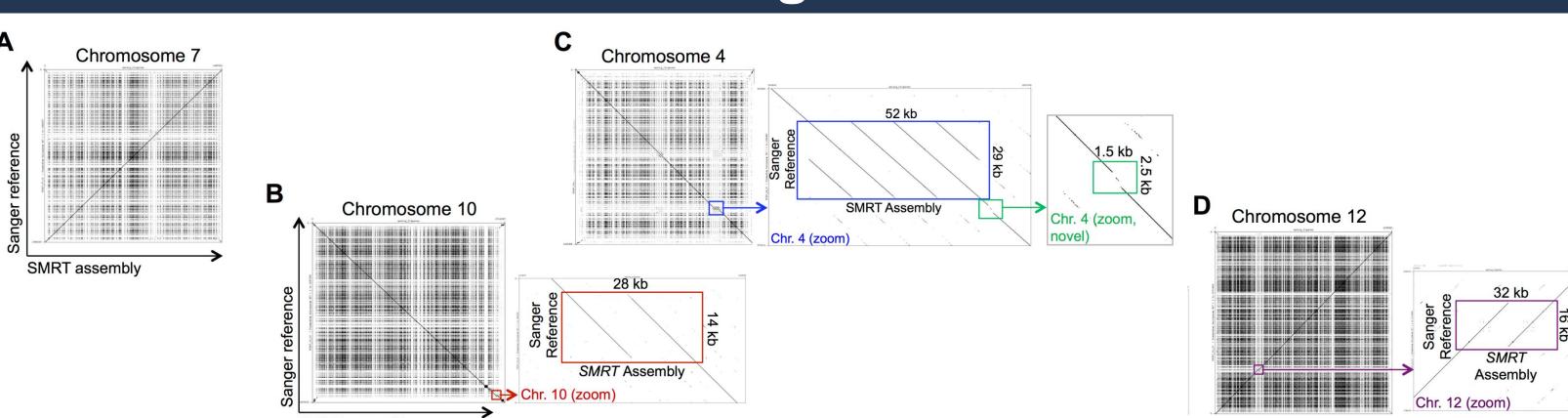


Figure 4. Dot plot comparisons of SMRT assembly to the reference 3D7 genome

Gepard<sup>5</sup> nucleotide alignments of *P. falciparum* SMRT assembly chromosomal contigs (X-axis) and chromosomes assembled from reference 3D7 genome (Y-axis; Sanger reference<sup>6</sup>). Each dot is a gray-scale representation of nucleotide identity within a 30-nucleotide window centered on that position. The main diagonal line shows the alignment between assemblies. **A)** Chromosome 7. **(B)** Chromosome 10. Zooming in to position 1,612,060, the SMRT assembly resolved a 14 kb tandem duplication relative to the reference. **(C)** Chromosome 4. Zooming in to position 939,044, the SMRT assembly resolved a 29 kb insertion. Further zooming to a position immediately downstream of this insertion shows a 1.5 kb stretch detected in the SMRT assembly with very low homology to the corresponding 2.5 kb stretch present in the reference genome, and is hence labeled 'novel'. **(D)** Chromosome 12. Zooming into position 1,707,528, the SMRT assembly resolved a 16 kb tandem duplication relative to the reference. Plots not drawn to scale.

# Resolving New Structural Features

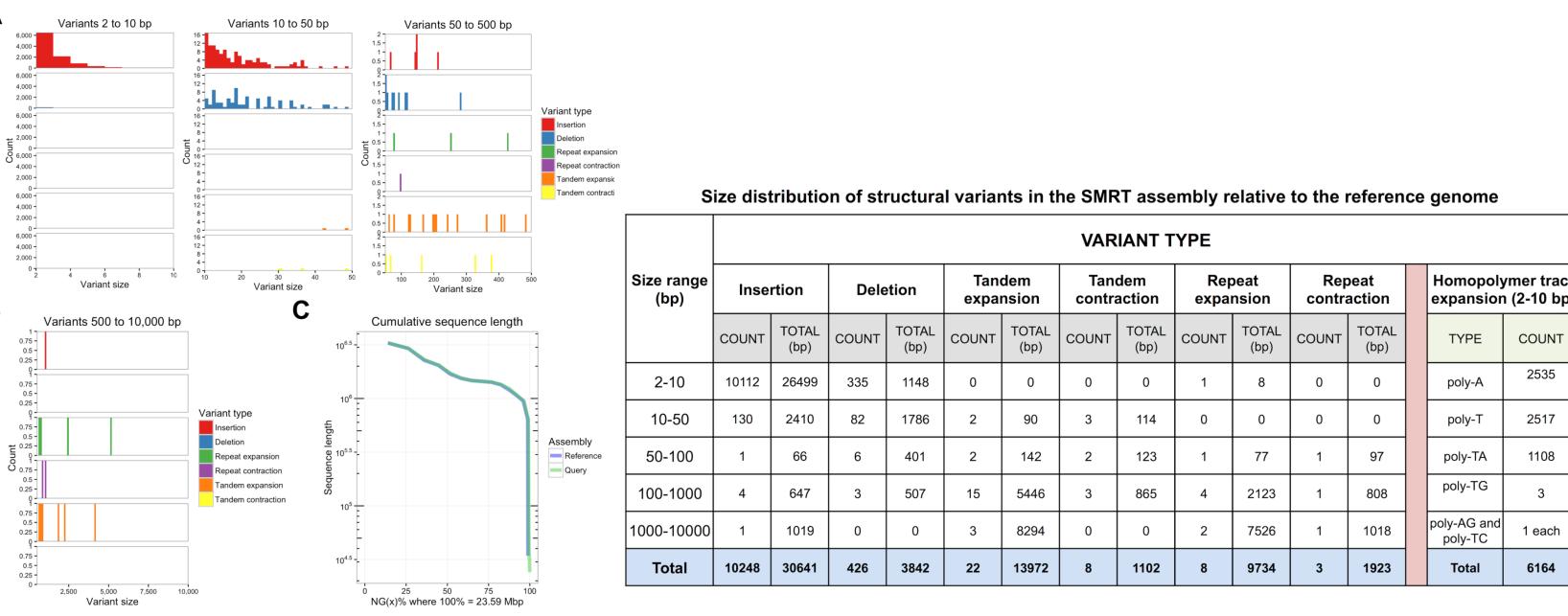


Figure 5. Classification of structural variation types

Variants ranging from 2 bp to 10 kb in size were called using Assemblytics<sup>7</sup>. **(A)** Size distribution analysis of variants from 2 bp to 500 bp in size showed that the majority of insertions are <50 bp in size while the majority of deletions are between 10-500 bp. **(B)** Larger structural variants (500 bp to 10 kb) are depicted with the x-axis representing variant size in bp and the y-axis representing variant number. **(C)** Cumulative sequence length plot showing the nearly identical contiguity and total size of the SMRT assembly (query) versus the reference. The length of each individual sequence is indicated on the y-axis with the cumulative sum of sorted sequence lengths on the x-axis. The reference genome contig N50 (50% on the x-axis) is 1.688 Mb, while the SMRT Sequencing assembly contig N50 is 1.712 Mb.

### Conclusions

With the high coverage of long reads, we were able to resolve the *P. falciparum* genome in unprecedented detail, despite its highly repetitive nature and high AT content. All but one chromosome was assembled telomere-to-telomere, and only one tandem repeat of >52 kb was not finished. The additional resolution to the repetitive elements contains previously hidden copies of genes vital to infectivity and virulence.