# Phased diploid genome assembly with single-molecule real-time sequencing



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Methods **Assembly Results** Abstract Sample Stat. Max While genome assembly projects have Assembly | # contigs | N50 size (a) FALCON Species Total coverage, Assembler | Sequence Contig Size (Mb) | scaffolds | (Mb) Size (Mb) been successful in many haploid and Initial assembly graph Read length N50 SV inbred species, the assembly of noninbred 131 1,102 11.186 Canu 4.573 contige Inbred Col-0 or rearranged heterozygous genomes 130-fold read N50 = 9 kbremains a major challenge. To address this **FALCON** 120 377 7.353 12.197 p-contigs challenge, we introduce the open-source 127 12.393 Inbred Cvi-0 FALCON and FALCON-Unzip algorithms to 120-fold Primary contig assemble long-read sequencing data into highly accurate, contiguous, and correctly Associate contig 1 (Alternative allele) phased diploid genomes. We generate new reference sequences for heterozygous (b) samples including an F1 hybrid of Arabidopsis thaliana, the widely cultivated Phase heterozygous SNPs and identify the haplotype of each read Vitis vinifera cv. Cabernet Sauvignon, and the coral fungus *Clavicorona pyxidata*, a) The initial assembly is computed by FALCON, which error corrects the raw samples that have challenged short-read reads (not shown) and then assembles the reads using a string graph of the read overlaps. The assembled contigs are further refined by FALCON-Unzip assembly approaches. The FALCONinto a final set of contigs and haplotigs. **b)** Phase heterozygous SNPs and group reads by haplotype. based assemblies are substantially more contiguous and complete than alternate (c) FALCON-Unzip short- or long-read approaches. The phased diploid assembly enabled the study Haplotype-resolved assembly graph of haplotype structure and heterozygosities SNPs SVs SNPs SVs SNPs between homologous chromosomes, including the identification of widespread heterozygous structural variation within coding sequences.





| A. thaliana |  | FALCON             | p-contigs | 120  | 260        | 6.073   | 14.370 |
|-------------|--|--------------------|-----------|------|------------|---------|--------|
|             | F1 Col-0 x CVI-0<br>120-fold, read N50 =<br>17 kb          | Canu               | contigs   | 219  | 1,897      | 1.554   | 15.379 |
|             |  | FALCON             | p-contigs | 143  | 426        | 7.923   | 13.386 |
|             |  |                    | a-contigs | 57   | 551        | 0.146   | 0.688  |
|             |  | FALCON-<br>Unzip   | p-contigs | 140  | 172        | 7.961   | 13.319 |
|             |  |                    | haplotigs | 105  | 248        | 6.920   | 11.648 |
|             | F1 Col-0 x CVI-0<br>short reads<br>60-fold<br>250 bp reads | Platanus           | scaffolds | 143  | 151,779    | 0.0269  | 0.329  |
|             |  | SOAPdenovo<br>k=93 | scaffolds | 260  | 691,629    | 0.00099 | 0.0825 |
| V. vinifera | 140-fold<br>read N50 = 15 kb                               | Canu               | contigs   | 1066 | 14,489     | 0.139   | 2.211  |
|             |  | FALCON             | p-contigs | 633  | 1,314      | 2.392   | 14.114 |
|             |  |                    | a-contigs | 184  | 1,164      | 0.278   | 0.804  |
|             |  | FALCON-<br>Unzip   | p-contigs | 591  | 718        | 2.173   | 14.079 |
|             |  |                    | haplotigs | 368  | 2,037      | 0.779   | 3.926  |
|             | short reads<br>46-fold<br>100 bp reads                     | SOAPdenovo<br>k=33 | scaffolds | 1728 | 12,879,081 | 0.0001  | 0.0368 |
|             |  | SOAPdenovo<br>k=43 | scaffolds | 507  | 767,707    | 0.0019  | 0.0310 |
| pyxidata    | 100-fold<br>read N50 = 16 kb                               | Canu               | contigs   | 60   | 432        | 0.646   | 4.390  |
|             |  | FALCON             | p-contigs | 43   | 133        | 1.49    | 4.829  |
|             |  |                    | a-contigs | 12   | 172        | 0.0805  | 0.407  |
|             |  | FALCON-<br>Unzip   | p-contigs | 42   | 82         | 1.484   | 4.778  |
|             |  |                    | haplotigs | 24   | 93         | 0.872   | 2.218  |

## **Resolving Phases**

(a)Initial assembly graph of a contig in the Arabidopsis F1 hybrid assembly. The different colors represents different haplotype blocks and phases.

(b)Assembly graph after "unzipping." Conceptually, the unzipping step identifies the heterozygous SNPs and uses them to remove overlaps between reads from different haplotypes. After removing such 50 overlaps, nodes from SNPs / and the different haplotypes in the assembly graph will no longer have edges between them. This allows FALCON-Unzip to identify long haplotype specific paths and construct haplotigs of them. The dashed circle region indicates haplotype blocks that can be extended through a bubble region.





c) Phased reads are used to open up the haplotype-fused path and subsequently generate a set of primary contigs and associated haplotigs.





Schematic on how differing levels of heterozygosity can affect assembly output

| S | short reads<br>86-fold<br>100 bp reads | Platanus           | scaffolds | 39 | 26,702  | 0.045   | 0.489 |
|---|--|--------------------|-----------|----|---------|---------|-------|
|   |  | SOAPdenovo<br>k=19 | scaffolds | 52 | 157,941 | 0.00055 | 0.070 |

### Conclusions

The highly fragmented polyploid genome output typical of contemporary assembly algorithms makes it difficult to probe for haplotype specific variation. With FALCON-Unzip, however, this heterozygosity information can be captured in the primary contigs and associated haplotigs, so the question of how haplotype specific variation can affect gene expression, methylation patterns and other regulatory interactions can be further examined. Looking forward, we expect SMRT Sequencing technology will allow us to further probe diploid and polyploid genomic diversity and understand its impact on genomic annotation, gene regulation and evolution.

### References



This plot shows the primary contigs and haplotigs aligned to chromosome 4 of the Arabidopsis TAIR reference assembly as grey line segments. Blue and Red colored dots show the number of Col-0 and Cvi-0 specific SNPs, respectively, per 50 kbp region of the assembled contig. The vertical orange lines indicate the centromere locations. The short vertical tick marks above the grey lines indicate the structural variations against Col-0 (blue) and Cvi-0 (red).



Chin et al. (2016). Phased diploid genome assembly with single-molecule real-time sequencing. Nat. Meth. (13)12, 1050-1054.

GitHub:

https://github.com/PacificBiosciences/FALCON

#### Acknowledgements

J. Lohr Vineyards and Wines, Felipe Simao Neto, L. Nagy, Joseph D. Puglisi, Florian Jupe, Alex Copeland and Various PacBio contributors. The project was supported in part by NIH award (R01-HG006677) and NSF awards (DBI-1350041 and IOS-1237880 to MCS; MCB 0929402 and MCB 1122246 to J.R.E). J.R.E is an investigator of the HHMI and Gordon and Betty Moore Foundation (GBMF 3034).

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