Genome sequence of the English grain aphid, Sitobion avenae and its endosymbiont Buchnera aphidicola

Stephen Byrne (b),^{1,*} Maximilian Schughart,^{1,2} James C. Carolan,³ Michael Gaffney,⁴ Peter Thorpe,⁵ Gaynor Malloch,⁶ Tom Wilkinson,² and Louise McNamara¹

¹Teagasc, Crop Science Department, Carlow R93 XE12, Ireland,

²School of Biology and Environmental Science, University College Dublin, Dublin 4, Ireland,

³Department of Biology, Maynooth University, Maynooth, Co. Kildare, W23 F2H6, Ireland,

⁴Teagasc, Ashtown Research Centre, Dublin D15 KN3K, Ireland,

⁵School of Medicine, University of St Andrews, North Haugh, KY16 9TF St Andrews, UK, and

⁶The James Hutton Institute, Invergowrie, Dundee DD2 5DA, UK

*Corresponding author: Teagasc, Crop Science Department, Oak Park, Carlow R93XE12, Ireland. Email: stephen.byme@teagasc.ie

Abstract

The English grain aphid, *Sitobion avenae*, is a major agricultural pest of wheat, barley and oats, and one of the principal vectors of barley yellow dwarf virus leading to significant reductions in grain yield, annually. Emerging resistance to and increasing regulation of insecticides has resulted in limited options for their control. Using PacBio HiFi data, we have produced a high-quality draft assembly of the *S. avenae* genome; generating a primary assembly with a total assembly size of 475.7 Mb, and an alternate assembly with a total assembly size of 430.8 Mb. Our primary assembly was highly contiguous with only 326 contigs and a contig N50 of 15.95 Mb. Assembly completeness was estimated at 97.7% using BUSCO analysis and 31,007 and 29,037 protein-coding genes were predicted from the primary and alternate assemblies, respectively. This assembly, which is to our knowledge the first for an insecticide resistant clonal lineage of English grain aphid, will provide novel insight into the molecular and mechanistic determinants of resistance and will facilitate future research into mechanisms of viral transmission and aphid behavior.

Keywords: aphid; PacBio HiFi; Sitobion avenae; genome

Introduction

Aphids (Hemiptera: Aphidoidea) represent one of the most important insect pests of temperate agriculture. Aphid feeding reduces crop yield by removing photoassimilates, transmitting plant viruses, and altering plant growth and development. They typically reproduce by cyclical parthenogenesis, a reproductive mode which alternates between a single sexual generation produced in autumn (with decreasing photoperiod and temperature) and several clonal generations produced during spring/summer conditions (Dedryver *et al.* 2005). The English grain aphid, Sitobion *avenae* Fabricius (Hemiptera: Aphididae), is one of the most destructive cereal aphids in Western Europe, feeding on cereals including barley, wheat, and rice (Figure 1).

The English grain aphid is a major vector of barley yellow dwarf virus (BYDV), an economically important plant virus. The primary method of *S. avenae* control is through the application of pyrethroid insecticides. However, over the past decade pyrethroid resistant clones have been frequently detected across Great Britain and Ireland. The most common resistance mechanism is termed knockdown resistance (kdr/super-kdr) and results from mutation of the voltage gated sodium channel (VGSC) gene, leading to amino acid substitutions within the channel protein that reduce the sensitivity to the specific pyrethroid (Foster *et al.* 2014).

Resistant *S. avenae* grain aphids were initially thought to be derived from a single, dominant, and established SA3 clone in England and Scotland (Malloch *et al.* 2016), which is sometimes referred to as a super-clone (Walsh *et al.* 2019), particularly when it becomes the prevalent clone within the overall species population. In a survey of kdr aphids conducted in Ireland in 2016, the dominant resistant clone detected in the kdr-SR (heterozygote) genotype was also the SA3 clone (Walsh *et al.* 2020). The kdrheterozygote SA3 clone can survive pyrethroid contact, and can continually reproduce parthenogenetically under laboratory conditions at a comparable rate to the unexposed individuals of the susceptible (kdr-SS) SA27 clone (Walsh *et al.* 2019). Therefore, the SA3 clone of *S. avenae* presents an interesting case for further studies involving insecticide resistance and viral transmission in agronomically important aphids.

In recent years, a number of annotated genomes have been produced for species within the subfamily Aphidinae; including Acyrthosiphon pisum (pea aphid) (IAGC 2010), Pentalonia nigronervosa (banana aphid) (Mathers et al. 2020), Myzus persicae (green peach aphid) (Mathers et al. 2021), Diuraphis noxia (Russian wheat

Received: November 06, 2021. Accepted: November 30, 2021

[©] The Author(s) 2021. Published by Oxford University Press on behalf of Genetics Society of America.

This is an Open Access article distributed under the terms of the Creative Commons Attribution License (https://creativecommons.org/licenses/by/4.0/), which permits unrestricted reuse, distribution, and reproduction in any medium, provided the original work is properly cited.



Figure 1 Sitobion avenae Fabricius (Hemiptera: Aphididae).

aphid) (Burger and Botha 2017), Rhopalosiphum maidis (com leaf aphid) (Chen et al. 2019), Myzus cerasi (black cherry aphid), and Rhopalosiphum padi (bird cherry oat aphid) (Thorpe et al. 2018), and Sitobion miscanthi (Indian grain aphid) (Jiang et al. 2019). However, no genome has been published to date for *S. avenae*, despite it being a major agricultural pest of wheat, barley and oats, and a major vector of BYDV.

To date, assemblies of aphid genomes have focused on collapsing divergent alleles and producing a consensus sequence of both haplotypes. While highly accurate short reads are suitable for characterizing genetic variation, and estimating transcript abundance, longer reads are generally preferable for de novo genome assembly applications. Although longer reads can suffer from lower accuracies which may impact assembly continuity and accuracy, the latest approaches to produce long reads (15–25 Kb) with high accuracy (Wenger *et al.* 2019) now offer opportunities to separate highly similar repeats and alleles, as was recently demonstrated (Nurk *et al.* 2020). A recent technical evaluation of assembly strategies in barley concluded that assemblies generated with HiFi data reach a level of contiguity previously only achievable with a complex process of iterative scaffolding (Mascher *et al.* 2021).

Here, we report the de novo genome sequence of the grain aphid, *S. avenae* SA3 clone and its endosymbiont *Buchnera aphidicola* using Pacific Biosciences (PacBio) HiFi sequencing data. On the basis of a 475.7 Mb primary assembly consisting of 326 contigs, we identified 31,007 protein-coding genes. We have also produced an alternate assembly of 434.1 Mb, representing alternate alleles and predicted 29,037 protein-coding genes. The *S. avenae* SA3 genome will lead to a better understanding of insecticide resistance and facilitate further research into aphid behavior and virus transmission in this agriculturally important species.

Materials and methods

Insect rearing, DNA isolation, and sequencing

A laboratory maintained colony of asexually reproducing *S. avenae*, originating from a single grain aphid was used for all DNA and RNA extractions in this study. The maternal grain aphid was collected in 2017 from a wheat field in Carlow, Ireland, and removed from the colony and stored after producing nymphs. The colony was maintained on barley plants in an insect incubator at 20°C and 16/8h day-night cycle. Genotyping of the original maternal aphid and aphids from following generations confirmed

that the aphids were of the SA3 clonal lineage, which has partial resistance to pyrethroid (Foster *et al.* 2014).

High molecular weight (HMW) DNA was extracted using the Nanobind Big DNA Kit (Circulomics, Baltimore, USA), following a manufacturers protocol [High molecular weight insect DNA extraction Protocol v0.18, 1/2020, Circulomics; Protocol 1: HMW (50 kb 400+ kb) DNA extraction from Drosophila species homogenized with pellet pestle] with some minor modifications. For the extractions, a bulk collection of 25 mg live S. avenae SA3 aphids was homogenized in a 1.5 ml microcentrifuge tube using 5001 cold Buffer CT and a sterilized plastic pestle. The quantity of DNA was estimated with a NanoDrop Spectrophotometer (Thermo Fisher Scientific, Waltham, MA, USA) and successful extraction of HMW-DNA was confirmed using agarose gel electrophoresis. Short read DNA sequencing (PE 150 bp) was carried out with an Illumina NovaSeq (NovoGene, UK) and over 26.2 Gbp of sequence data was generated. HMW-DNA was then sequenced using PacBio CCS technology to generate 31.98 Gbp of HiFi reads with an average length of 11.7 Kb.

Transcriptome sequencing and quantification

To support the ab initio gene predictions RNA sequencing was conducted for a total of 24 S. avenae (SA3-clone) samples (6X winged-heads, 6X winged-bodies, 6X unwinged-aphids, and 6X winged-aphids). Each sample consisted of 50 individual aphids, which were transferred to a 1.5 ml RNAse free micro-centrifuge tube containing 5001 Lysis Buffer (101 2-Mercaptoethanol + 5001 Lysis Solution). The aphids were homogenized using a plastic pestle and a motorized hand drill. The homogenate was snap-frozen in liquid nitrogen and homogenized again with the pestle. This step was repeated three times in total. RNA extraction was conducted using the GenElute Mammalian Total RNA Miniprep Kit (Sigma-Aldrich; Merck KGaA, Darmstadt, Germany), with minor modifications with each extraction comprising 50 aphids per sample. For the head and body samples, 50 live aphids were transferred to a glass microscope slide holding a droplet of lysis buffer, where the heads and bodies were separated by dissecting in front of the thorax using a sterile scalpel. Heads and bodies were pooled separately into 1.5 ml RNAse free micro-centrifuge tubes containing 5001 Lysis Buffer. Homogenization and RNA extraction was conducted following the same steps as the whole bodies. RNA was quantified with a NanoDrop Spectrophotometer (Thermo Fisher Scientific, Waltham, MA, USA) and the quality was assessed using agarose gel electrophoresis.

Strand-specific mRNA libraries were prepared and sequenced with DNBseq (BGI, Hong Kong) to generate a minimum of 30 million paired reads (150 bp) per sample. Raw reads were filtered to remove adaptor sequences, contamination, and lowquality reads; leaving between 32.9 and 35.5 million read pairs per sample.

Genome assembly

The genome size of *S. avenae* was estimated using k-mer analysis; a k-mer (k = 21) distribution was generated with Jellyfish (v2.2.10) (Marçais and Kingsford 2011) using the HiFi reads and genome characteristics generated with GenomeScope (Vurture *et al.* 2017).

The S. avenae PacBio HiFi data consisted of 31.98 Gb with a mean read length of 11.7 Kb, which was assembled using hifiasm (0.14-r312) (Cheng et al. 2021) with default parameters. The completeness of the resulting primary and alternate assemblies were assessed using Benchmarking Universal Single-Copy Orthologs (BUSCO) version 3.0.2 (Simão et al. 2015) run in genome mode and with the lineage dataset Arthropoda odb9 (consisting of 1066)

BUSCO groups). We also used the K-mer Analysis Toolkit (KAT) (v2.4.2) (Mapleson *et al.* 2017) to generate assembly spectra copy number plots (spectra-cn) to check assembly coherence against reads used to generate assembly.

The primary and alternative assemblies were both screened for contaminants using the BlobTools pipeline (v1.1.1) (Laetsch and Blaxter 2017). Illumina data were aligned to each assembly using bwa (Li 2013), contigs were given a taxonomic assignment based on blastn results against NCBI nt database, and plots were generated showing contig GC content, coverage, and taxonomic assignment. The plots and results were used to remove non-Hemiptera contigs and likely contaminants from both primary and alternate assemblies.

Repeat masking

A de novo repeat library was generated using RepeatModeler (v2.0.1) (Flynn et al. 2020), integrating results from RepeatScout (Price et al. 2005), TRF (Benson 1999), and RECON Bao and Eddy (2002). The resulting repeats were filtered to remove repeats that are part of protein-coding genes. A protein set was downloaded from AphidBase (aphidbase-2.1b-pep.fasta) and TransposonPSI (http://transposonpsi.sourceforge.net) was used to identify potential transposon ORFs, and the protein set was filtered to remove proteins with sequence homology to transposable elements. The repeats from RepeatModeler were used in a blastx search against the filtered protein set, and hits were removed from our RepeatModeler library to generate a final repeat library for use in repeat masking. RepeatMasker was configured with the complete Dfam library (version 3.2), and was used with the de novo filtered repeat library to identify and soft-mask repeats in the assemblies prior to annotation.

Genome annotation

Structural annotation of the genome was carried out using the BRAKER2 pipeline (v2.1.5) (Stanke *et al.* 2006, 2008; Li *et al.* 2009; Barnett *et al.* 2011; Lomsadze *et al.* 2014; Buchfink *et al.* 2015; Hoff *et al.* 2016, 2019). The pipeline was used with 24 strand-specific RNAseq libraries that were aligned to the soft-masked genome using HISAT2 (Kim *et al.* 2019) to provide hints, which were then used with GenMark-ET to predict genes and retrain Augustus.

Functional annotation of predicted proteins was carried out using InterProScan (v5.51-85.0) (Jones *et al.* 2014; Blum *et al.* 2021) to search for protein domains, motifs, and signatures using publicly available databases.

RNA-seq data were pseudoaligned to the predicted transcriptome and transcript abundance determined using Kallisto (Bray *et al.* 2016). Differential gene expression was carried out using Sleuth (Pimentel *et al.* 2017) with two pairwise comparisons; heads compared to bodies, and winged compared to unwinged. To identify the transcripts differentially expressed we ran a likelihood ratio test (LRT), followed by a Wald test to determine β estimates and only transcripts overlapping with the LRT analysis were retained.

Orthology and phylogenomic analysis

The protein sequences from our S. avenae assembly and nine previously published aphid genomes (Aphis glycines, A. pisum, Cinara cedri, D. noxia, M. cerasi, M. persicae, P. nigronervosa, R. maidis, and R. padi) were clustered into orthogroups using OrthoFinder v2.5.4 (Emms and Kelly 2015, 2019). Input sequence data for OrthoFinder consisted of the longest transcript at each gene, downloaded from https://doi.org/10.5281/zenodo.3765644 for previously published aphid genomes (Mathers et al. 2020). OrthoFinder was run using the multiple sequence alignment (MSA) method for tree inference (Price *et al.* 2010; Emms and Kelly 2017, 2018) (-M msa -S diamond -T fastree), conferring species tree from a concatenated MSA of single copy genes. The species tree was visualized using Dendroscope (Huson *et al.* 2007).

A recent study quantified gene numbers for detoxification-related genes in seven aphid species from the Macrosiphini and Aphidini tribes (Chen *et al.* 2019). We have updated this with inclusion of gene numbers from *S. avenae* (this study), and the recently sequenced banana aphid, *P. nigronervosa* (Mathers *et al.* 2020). In line with the previous study (Chen *et al.* 2019), we identified genes based on protein domains predicted through InterProScan; cytochrome P450 genes(InterPro ID: IPR001128), glutathione S-transferases (GSTs) (InterPro ID: IPR004045, IPR004046), carboxylesterases (InterPro domain ID: IPR002018), UDP-glucuronosyltransferases (InterPro domain ID: IPR002213), and ABC transporters (InterPro ID: IPR003439).

Endosymbiont assembly and annotation

The hifiasm assembly generated 937 contigs with the taxonomic assignment Enterobacterales, a total sum of 21.25 Mb, and an N50 of 22.6 Kb. It was suspected that much of these contigs originate from *B. aphidicola*. In order to generate a more contiguous assembly of the *B. aphidicola* genome, we first mapped HiFi data to the primary assembly using bwa (Li 2013), created a bed file of non-Hemiptera contigs, and used samtools (Li *et al.* 2009) to extract those reads that mapped to non-Hemiptera contigs. The de novo assembler Flye (v2.8) (Kolmogorov *et al.* 2020) was then used to assemble these reads (with options; –pacbio-hifi, and –meta). The *B. aphidicola* genome was identified from this assembly and annotated using prokka (Seemann 2014). The annotated *B. aphidicola* genome diagram (Pritchard *et al.* 2006).

Results and discussion

The S. avenae genome characteristics

The size of the S. avenae genome was estimated to be 452.7 Mb (Figure 2) using k-mer analysis (k=21) based on the HiFi sequence data. Using this estimate we have generated over a 70-fold sequence coverage of the genome with PacBio HiFi data. This is comparable to a genome size estimate of 431.1 Mb for S. avenae that was determined by flow cytometry (Wenger et al. 2020), and where the average genome size of 19 aphid species was 464.4 ± 21.4 Mb. As a comparison, the genome assembly size of the closely related Indian grain aphid S. miscanthi was 397.9 Mb (Jiang et al. 2019). The HiFi data set released as part of this study represents the first publicly available deep coverage HiFi data set for an aphid species, and complements recently released HiFi data of four complex plant and animal genomes and a mock metagenome (Hon et al. 2020),

The genome repeat length was estimated to be 33.7% and is in line with repeat content for a range of other aphid species including *S. miscanthi*, where total repeat content was estimated at 31.15% (Jiang *et al.* 2019).

Sitobion avenae genome assembly and completeness

A de novo assembly of the PacBio HiFi data with hifiasm produced a primary assembly of 497.9 Mb and an alternate assembly of 434.1 Mb. We evaluated the assembly for contamination using plots of GC proportion of contigs (with taxonomic assignment) against coverage with Illumina short reads (Figure 3).



Figure 2 A K-mer (K = 21) distribution based on the high coverage HiFi reads as modeled and visualized by genomescope. The first and second dotted lines correspond to the peak of the heterozygous and homozygous portion of the genome, respectively. The third and fourth dotted lines correspond to the duplicated heterozygous and homozygous regions, respectively.



Figure 3 A taxon-annotated GC proportion and coverage plot of the S. *avenae* genome. Each bubble represents an assembled contig and bubble size is linked to contg size, and bubbles are colored according to taxon annotation. The many small orange bubbles correspond to B. *aphidicola* contigs with a total length of 21.25 Mb, and the predominantly larger blue bubbles correspond to Hemiptera contigs with a total length of 475.68 Mb.

Encouragingly, 98.76% of the Illumina reads mapped to the HiFi primary assembly, and 94.57% of the Illumina reads mapped to the HiFi alternate assembly.

As expected, the majority of large contigs were assigned as Hemiptera, making up 475.68 Mb of the total assembly length. However, the majority of contigs (937) in the assembly were assigned as Enterobacterales, making up 21.25 Mb of the total assembly length and likely originating from *B. aphidicola*. All non-



Figure 4 KAT k-mer spectra plot comparing k-mer content of HiFi reads to k-mer content of final primary assembly (after removing non-Hemiptera contigs). The first peak represents the heterozygous content and the second peak the homozygous content. The black peak represents lost content and represents approximately half the heterozygous content (47.89%). The amount of duplicated content is 5.29% of the homozygous peak and 3.60% of the heterozygous peak.

Hemiptera contigs were removed, giving a final primary assembly of 475.7 Mb and an alternate assembly of 430.8 Mb. An analysis of the final primary genome assembly using k-mer spectra predominantly shows a single haplotype mosaic with each heterozygous region represented once in the assembly (Figure 4). The lost content in the heterozygous peak represents half the heterozygous content, which will have been captured in the alternate assembly.

The final primary assembly consisted of 326 contigs with an N50 of 15.95 Mb (Table 1), and represents good continuity when compared to other published aphid genomes; for example, P. nigronervosa with 20,873 contigs and a contig N50 of 64.04 Kb (Mathers et al. 2020), M. cerasi with 49,349 scaffolds and a scaffold N50 of 23.3 Kb (Thorpe et al. 2018), R. padi with 15,615 scaffolds and a scaffold N50 of 116.2 Kb (Thorpe et al. 2018). However, the above assemblies were all generated using short-read data and a more relevant comparison would be to two recent aphid assemblies, R. maidis and S. miscanthi, generated using PacBio long-read sequencing (continuous long reads as opposed to the CCS/HiFi data generated in the current study). In both cases collapsed assemblies representing a single haplotype mosaic were generated; in the case of R. maidis the assembly consisted of 689 contigs with a contig N50 of 9.1 Mb, and in the case of S. miscanthi the assembly consisted of 1148 contigs with a contig N50 of 1.6 Mb. Further scaffolding of both assemblies using chromosome conformation capture methods generated chromosome level scaffolds, and while further scaffolding is outside the scope of the current study, it is anticipated that similar approaches would generate chromosome-scale assemblies given our highly contiguous contig assembly as a starting point.

To assess genome completeness a BUSCO analysis using an Arthropoda lineage data set was conducted. This analysis involves the identification of conserved single-copy, orthologous genes, and enabled a determination of completeness and level of duplication in both primary and alternate assemblies. In the primary assembly, 97.7% of BUSCOs were present and complete and 3.9% were duplicated, compared to 93.8% of BUSCOs complete and 6.4% duplicated in the alternate assembly (Table 1). The high levels of completeness in both assemblies and low levels of

Table 1 Statistics of the S. avenae genome assembly

	Primary contigsª	Alternate contigs ^b
Total assembly size (Mb)	475.7	430.8
Number of contigs	326	3,139
N50 contig length (Mb)	15.95	0.36
Max contig length (Mb)	36.43	2.14
Min contig length (bp)	4,802	10,063
Complete BUSCOs	97.7% (1,042)	93.8% (1,000)
Complete and single copy BUSCOs	93.8% (1,000)	87.4% (932)
Complete and duplicated BUSCOs	3.9% (42)	6.4% (68)
Fragmented BUSCOs	0.4% (4)	1.1% (12)
Missing BUSCOs	1.9% (20)	5.1% (54)
Protein coding genes (n)	31,007	29,037
Transcripts (n)	33,389	31,259
Mean CDS length (bp)	1,231	1,188
Mean exons per mRNA (n)	5	5
Total CDS length (Mb)	41.1	37.1

^a Contigs including one set of haplotypes after filtering non-Hemiptera

contigs. ^b Assembly consisting of alternate alleles of contigs present in the primary assembly after filtering non-Hemiptera contigs.

duplicated BUSCOs support the assessment that alleles from both haplotypes have been comprehensively captured, and that these have been successfully partitioned into two assemblies.

Sitobion avenae annotation and transcript quantification

We identified and soft-masked 31.88% of the primary genome assembly, which was in line with our estimates of repeat content from k-mer analysis and the repeat content of S. miscanthi (31.15) (Jiang et al. 2019). Structural annotation of the masked genome was carried out using the BRAKER2 pipeline with over 247 Gbp of RNAseq evidence, generated from 24 strand-specific libraries. This resulted in the annotation of 31,007 protein-coding genes and 33,389 transcripts, a mean exon length of 224 bp, and with the total length of exons accounting for just over 41 Mbp (8.6%) of the genome (Table 1). The number of predicted genes is similar to what has been reported for many aphid species (IAGC 2010; Burger and Botha 2017; Thorpe et al. 2018; Mathers et al. 2020); although is approximately double the number of genes recently predicted in an assembly of the S. miscanthi genome (Jiang et al. 2019). We also carried out annotation of the alternate assembly using the same strategy and predicted 29,037 genes with similar metrics to the primary annotation (Table 1). Functional annotation of predicted proteins was carried out using InterProScan (v5.51-85.0) (Jones et al. 2014; Blum et al. 2021) to search for protein domains, motifs, and signatures using publicly available databases (see Supplementary material with functional annotation).

Sequence data from the 24 strand-specific RNAseq libraries were pseudolaligned to the above annotations (33,389 transcripts) and transcript abundance estimated. An initial PCA identified a potential sample mix-up, where an unwinged sample was labeled as winged and this sample was therefore removed from further analysis. PCA with estimated counts clearly separated samples on the first principal component according to body/head and winged/unwinged (Figure 5), with PC1 explaining over 75% of the variance in both cases. The fraction of reads aligned to the reference transcriptome in all cases was approximately 42%; alignment rates to the genome with HiSat2 were over 85%. Examples of alignment rates to predicted transcripts in other aphid species ranged between 49% and 64% (Thorpe *et al.* 2018). We identified 8660 transcripts differentially expressed between



Figure 5 PCA of transcript abundance based on body and head samples (top plot) and winged and unwinged aphids (bottom plot). The horizontal axis represents the first principal component and the vertical axis represents the second principal component.



Figure 6 Maximum likelihood phylogeny of aphid species included in Mathers *et al.* (2020) with addition of *S. avenae* from this study. The species tree was inferred from a concatenated multiple sequence alignment of 4249 single copy genes present in all species and there was full support at all branches. Branch lengths are in amino acid substitutions per site.

head and body samples, and 3133 transcripts differentially expressed between winged and unwinged samples, and sleuth objects associated with this analysis are available as Supplementary data (winged/unwinged, and https://doi.org/10. 6084/m9.figshare.14797557).

Phylogenomic analysis

We carried out orthology clustering of our predicted proteins from S. avenae and nine other aphid species. OrthoFinder assigned 234,168 genes (91.9%) to 23,797 orthogroups (see Supplementary File). A total of 7497 orthogroups were shared by all 10 species present, including 4249 single-copy genes present in all species (see Supplementary material). The percentage of S. avenae genes in orthogroups was 91.9%, including 510 S. avenae specific orthogroups. Complete orthogroup data for the comparative analysis is available as Supplementary data. A species tree was inferred from a concatenated multiple sequence alignment of the 4249 one-to-one orthologs (Figure 6). The species tree identified that S. avenae was close to the pea aphid (A. pisum), which confirms phylogeny established from fragments of mitochondrial cytochrome oxidase I and 12S rRNA genes (Papasotiropoulos et al. 2013).

Detoxification and insecticide resistance

Several gene families have been implicated in metabolic resistance to plant defense compounds and insecticides (reviewed in Li et al. 2007). These include the cytochrome P450 monooxygenases (P450s), carboxylesterases, UDP-glucuronosyltransferases, glutathione-S-transferases (GSTs), and ABC transporters. The number of detoxification-related genes was recently quantified for seven aphid species (Chen *et al.* 2019), and we have updated this with numbers from *P. nigronervosa* (Mathers *et al.* 2020) and *S. avenae* (Figure 7).

The greatest number of detoxification genes was present in A. pisum, followed by S. avenae, which is the species most closely related to A. pisum on the phylogenetic species tree shown in Figure 6. In particular, relatively high numbers of GSTs (23) and UDP-glucuronosyltransferases (65) were identified in S. avenae (Figure 7). GSTs have been implicated in detoxification of pyrethroids; for example, GSTs conferred resistance to pyrethroids in the brown planthopper Nilaparvata lugens by attenuating pyrethroid-induced lipid peroxidation (Vontas et al. 2001), and similarly a UDP-glucuronosyltransferases was shown to play a role in detoxification of pesticides by eliminating oxidative stress in Apis cerana (Cui et al. 2020). Of the 23 GST genes identified in S. avenae, two were placed in an S. avenae specific orthogroup, one was not placed in any orthogroup, eight were placed in five A. pisum and S. avenae specific orthogroups, and the remaining eleven in orthogroups with genes from multiple aphid species. Studies indicate that gene duplication may be widely used mechanisms of adaptive evolution in aphid species (reviewed in Bass and Field 2011).



Figure 7 Gene numbers in Aphidini and Macrosiphini species identified as ABC transporters (InterPro ID: IPR003439), carboxylesterases (InterPro domain ID: IPR002018), cytochrome P450s (InterPro ID: IPR001128), glutathione S-transferases (InterPro ID: IPR004045, IPR004046), and UDPglucuronosyltransferases (InterPro domain ID: IPR002213). These genes have been linked with detoxification and insecticide resistance.

Buchnera aphidicola assembly and annotation

We extracted reads that did not map to Hemiptera contigs and assembled these reads using flye, which resulted in the assembly of a circular contig of 637,558 bp (see Supplementary Figure) with over 2500 times coverage and sharing the greatest sequence homology with the obligate endosymbiont *B. aphidicola*.

Annotation of this genome with prokka identified three rRNA, 32 tRNA, and 572 CDS. The most recent shared *Buchnera* ancestor possessed 616 protein-coding genes, and a recent study found that 257 of these genes were present in all strains of a diverse collection of *Buchnera*. Interestingly, 359 genes were missing in at least one of the 39 genomes; leading to genomes ranging in length from 412 to 646 Kb and containing anywhere from 354 to 587 protein-coding genes (Chong *et al.* 2019). A *Buchnera* strain from *S. avenae* was included in the above study and CDS number (572) was identical, and genome length (636,177) comparable to the *Buchnera* genome sequenced in the current study.

Conclusion

Using PacBio HiFi data, we have produced, to our knowledge, the first draft assembly of the *S. avenae* genome; generating a primary assembly with a total assembly size of 475.7 Mb, and an alternate assembly had high continuity with only 326 contigs and a contig N50 of 15.95 Mb, and a completeness of 97.7% as estimated using BUSCO analysis. We predicted 31,007 protein-coding genes in the primary assembly and 29,037 in the alternate assembly. This assembly of a strain with partial resistance to insecticides will facilitate research into mechanisms of resistance, and help promote future research into mechanisms of aphid behavior and virus transmission.

Data availability

A BioProject with accession number PRJNA730105 has been created on NCBI and both Illumina and PacBio HiFi data have been deposited (SRR14554260 and SRR14566019). The primary, alternate, and endosymbiont assemblies, associated GFF files and functional annotation, orthology analysis, and supplementary diagrams have been deposited in the following collection on Figshare (see grain aphid genomics, https://doi.org/10.6084/m9. figshare.c.5425896.v1). The RNA sequencing data have been deposited in ArrayExpress with accession number E-MTAB-10540, and data objects associated with differential expression analysis have deposited on Figshare (see grain aphid genomics).

Acknowledgments

This research was carried out using the Teagasc highperformance computing cluster and storage systems, and the support of Dr. Paul Cormican is greatly appreciated.

Funding

Teagasc grant-in-aid. MS. is supported by a Teagasc Walsh Scholarship. PT: bioinformatics and computational biology analyses were supported by the University of St Andrews Bioinformatics Unit (AMD3BIOINF), funded by Wellcome Trust ISSF awards 105621/Z/14/Z and XISF6P. The authors declare that there is no conflict of interest.

Literature cited

- Bao Z, Eddy SR. 2002. Automated de novo identification of repeat sequence families in sequenced genomes. Genome Res. 12: 1269–1276.
- Barnett DW, Garrison EK, Quinlan AR, Strömberg MP, Marth GT. 2011. BamTools: a C++ API and toolkit for analyzing and managing BAM files. Bioinformatics. 27:1691–1692.
- Bass C, Field LM. 2011. Gene amplification and insecticide resistance. Pest Manag Sci. 67:886–890.
- Benson G. 1999. Tandem repeats finder: a program to analyze DNA sequences. Nucleic Acids Res. 27:573–580.
- Blum M, Chang H-Y, Chuguransky S, Grego T, Kandasaamy S, et al. 2021. The interpro protein families and domains database: 20 years on. Nucleic Acids Res. 49:D344–D354.
- Bray NL, Pimentel H, Melsted P, Pachter L. 2016. Near-optimal probabilistic RNA-seq quantification. Nat Biotechnol. 34:525–527.
- Buchfink B, Xie C, Huson DH. 2015. Fast and sensitive protein alignment using diamond. Nat Methods. 12:59–60.
- Burger NFV, Botha A-M. 2017. Genome of Russian wheat aphid an economically important cereal aphid. Stand Genomic Sci. 12: 1–12.
- Chen W, Shakir S, Bigham M, Richter A, Fei Z, et al. 2019. Genome sequence of the corn leaf aphid (*Rhopalosiphum maidis* fitch). Gigascience. 8:giz033.
- Cheng H, Concepcion GT, Feng X, Zhang H, Li H. 2021. Haplotype-resolved de novo assembly using phased assembly graphs with hifiasm. Nat Methods. 18:170–175.
- Chong RA, Park H, Moran NA. 2019. Genome evolution of the obligate endosymbiont *Buchnera aphidicola*. Mol Biol Evol. 36:1481–1489.
- Cui X, Wang C, Wang X, Li G, Liu Z, et al. 2020. Molecular mechanism of the UDP-Glucuronosyltransferase 2B20-like Gene (AccUGT2b20-like) in Pesticide Resistance of *Apis cerana cerana*. Front Genet. 11:592595.
- Dedryver C-A, Riault G, Tanguy S, Gallic JL, Trottet M, et al. 2005. Intra-specific variation and inheritance of BYDV-PAV transmission in the aphid Sitobion avenae. Eur J Plant Pathol. 111:341–354.
- Emms DM, Kelly S. 2015. OrthoFinder: solving fundamental biases in whole genome comparisons dramatically improves orthogroup inference accuracy. Genome Biol. 16:14.
- Emms DM, Kelly S. 2017. STRIDE: species tree root inference from gene duplication events. Mol Biol Evol. 34:3267–3278.
- Emms DM, Kelly S. 2018. STAG: species tree inference from all genes. BioRxiv. 267914. https://doi.org/10.1101/267914.
- Emms DM, Kelly S. 2019. OrthoFinder: phylogenetic orthology inference for comparative genomics. Genome Biol. 20:1–14.
- Flynn JM, Hubley R, Goubert C, Rosen J, Clark AG, et al. 2020. RepeatModeler2 for automated genomic discovery of transposable element families. Proc Natl Acad Sci USA. 117:9451–9457.
- Foster SP, Paul VL, Slater R, Warren A, Denholm I, et al. 2014. A mutation (L1014f) in the voltage-gated sodium channel of the grain aphid, Sitobion avenae, is associated with resistance to pyrethroid insecticides. Pest Manag Sci. 70:1249–1253.
- Hoff KJ, Lange S, Lomsadze A, Borodovsky M, Stanke M. 2016. BRAKER1: unsupervised RNA-seq-based genome annotation with GeneMark-ET and AUGUSTUS. Bioinformatics. 32:767–769.
- Hoff KJ, Lomsadze A, Borodovsky M, Stanke M. 2019. Whole-genome annotation with braker. In: Kollmar M. (eds) Gene Prediction. Methods in Molecular Biology, vol 1962. Humana, New York, NY: Springer. p. 65–95. https://doi.org/10.1007/978-1-4939-9173-0_5.

- Hon T, Mars K, Young G, Tsai Y-C, Karalius JW, et al. 2020. Highly accurate long-read HiFi sequencing data for five complex genomes. Sci Data. 7:11.
- Huson DH, Richter DC, Rausch C, Dezulian T, Franz M, et al. 2007. Dendroscope: an interactive viewer for large phylogenetic trees. BMC Bioinformatics. 8:460.
- Jiang X, Zhang Q, Qin Y, Yin H, Zhang S, et al. 2019. A chromosome-level draft genome of the grain aphid Sitobion miscanthi. Gigascience. 8:giz101.
- Jones P, Binns D, Chang H-Y, Fraser M, Li W, et al. 2014. Interproscan 5: genome-scale protein function classification. Bioinformatics. 30:1236–1240.
- Kim D, Paggi JM, Park C, Bennett C, Salzberg SL. 2019. Graph-based genome alignment and genotyping with HISAT2 and HISAT-genotype. Nat Biotechnol. 37:907–915.
- Kolmogorov M, Bickhart DM, Behsaz B, Gurevich A, Rayko M, et al. 2020. metaFlye: scalable long-read metagenome assembly using repeat graphs. Nat Methods. 17:1103–1110.
- Laetsch DR, Blaxter ML. 2017. BlobTools: interrogation of genome assemblies. F1000Res. 6:1287.
- Li H. 2013. Aligning sequence reads, clone sequences and assembly contigs with BWA-MEM. arXiv preprint arXiv:1303.3997. https://arxiv.org/abs/1303.3997.
- Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, *et al.*; 1000 Genome Project Data Processing Subgroup. 2009. The Sequence Alignment/Map format and SAMtools. Bioinformatics. 25: 2078–2079.
- Li X, Schuler MA, Berenbaum MR. 2007. Molecular mechanisms of metabolic resistance to synthetic and natural xenobiotics. Annu Rev Entomol. 52:231–253.
- Lomsadze A, Burns PD, Borodovsky M. 2014. Integration of mapped RNA-seq reads into automatic training of eukaryotic gene finding algorithm. Nucleic Acids Res. 42:e119.
- Malloch G, Foster S, Williamson M. 2016. Monitoring Pyrethroid Resistance (kdr) and Genetic Diversity in UK Populations of the Grain Aphid, Sitobion avenae during 2015. AHDB-Potatoes Agriculture & Horticulture Development Board, Stoneleigh Park, Kenilworth, Warwickshire, UK, CV8 2TL. https://potatoes.ahdb.org.uk/sites/ default/files/publication_upload.
- Mapleson D, Garcia Accinelli G, Kettleborough G, Wright J, Clavijo BJ. 2017. KAT: a K-mer analysis toolkit to quality control NGS datasets and genome assemblies. Bioinformatics. 33:574–576.
- Marçais G, Kingsford C. 2011. A fast, lock-free approach for efficient parallel counting of occurrences of k-mers. Bioinformatics. 27: 764–770.
- Mascher M, Wicker T, Jenkins J, Plott C, Lux T, *et al.* 2021. Long-read sequence assembly: a technical evaluation in barley. Plant Cell. 33:1888–1906.
- Mathers TC, Mugford ST, Hogenhout SA, Tripathi L. 2020. Genome sequence of the banana aphid, *Pentalonia nigronervosa* coquerel (Hemiptera: Aphididae) and its symbionts. G3 (Bethesda). 10: 4315–4321.
- Mathers TC, Wouters RH, Mugford ST, Swarbreck D, Van Oosterhout C, et al. 2021. Chromosome-scale genome assemblies of aphids reveal extensively rearranged autosomes and long-term conservation of the X chromosome. Mol Biol Evol. 38:856–875.
- Nurk S, Walenz BP, Rhie A, Vollger MR, Logsdon GA, et al. 2020. HiCanu: accurate assembly of segmental duplications, satellites, and allelic variants from high-fidelity long reads. Genome Res. 30:1291–1305.
- Papasotiropoulos V, Tsiamis G, Papaioannou C, Ioannidis P, Klossa-Kilia E, et al. 2013. A molecular phylogenetic study of aphids

(Hemiptera: Aphididae) based on mitochondrial DNA sequence analysis. J Biol Res. 20:195.

- Pimentel H, Bray NL, Puente S, Melsted P, Pachter L. 2017. Differential analysis of RNA-seq incorporating quantification uncertainty. Nat Methods. 14:687–690.
- Price AL, Jones NC, Pevzner PA. 2005. De novo identification of repeat families in large genomes. Bioinformatics. 21:i351–i358.
- Price MN, Dehal PS, Arkin AP. 2010. FastTree 2–approximately maximum-likelihood trees for large alignments. PLoS One. 5: e9490.
- Pritchard L, White JA, Birch PR, Toth IK. 2006. GenomeDiagram: a python package for the visualization of large-scale genomic data. Bioinformatics. 22:616–617.
- Seemann T. 2014. Prokka: rapid prokaryotic genome annotation. Bioinformatics. 30:2068–2069.
- Simão FA, Waterhouse RM, Ioannidis P, Kriventseva EV, Zdobnov EM. 2015. BUSCO: assessing genome assembly and annotation completeness with single-copy orthologs. Bioinformatics. 31: 3210–3212.
- Stanke M, Diekhans M, Baertsch R, Haussler D. 2008. Using native and syntenically mapped cDNA alignments to improve de novo gene finding. Bioinformatics. 24:637–644.
- Stanke M, Schöffmann O, Morgenstern B, Waack S. 2006. Gene prediction in eukaryotes with a generalized hidden Markov model that uses hints from external sources. BMC Bioinformatics. 7:62.
- The International Aphid Genomics Consortium. 2010. Genome sequence of the pea aphid Acyrthosiphon pisum. PLoS Biol. 8: e1000313.

- Thorpe P, Escudero-Martinez CM, Cock PJ, Eves-van den Akker S, Bos JI. 2018. Shared transcriptional control and disparate gain and loss of aphid parasitism genes. Genome Biol Evol. 10:2716–2733.
- Vontas JG, Small GJ, Hemingway J. 2001. Glutathione S-transferases as antioxidant defence agents confer pyrethroid resistance in Nilaparvata lugens. Biochem J. 357:65–72.
- Vurture GW, Sedlazeck FJ, Nattestad M, Underwood CJ, Fang H, et al. 2017. GenomeScope: fast reference-free genome profiling from short reads. Bioinformatics. 33:2202–2204.
- Walsh LE, Gaffney M, Malloch G, Foster S, Williamson M, et al. 2019. First evidence of retained sexual capacity and survival in the pyrethroid resistant Sitobion avenae (F.) (Hemiptera: Aphididae) SA3 super-clone following exposure to a pyrethroid at current field-rate. Irish J Agricul Food Res. 58:21–26.
- Walsh LE, Schmidt O, Williamson MS, Gaffney MT. 2020. In-field prevalence of resistant grain aphid Sitobion avenae (fabricius). JSTOR 120:29–38.
- Wenger AM, Peluso P, Rowell WJ, Chang P-C, Hall RJ, et al. 2019. Accurate circular consensus long-read sequencing improves variant detection and assembly of a human genome. Nat Biotechnol. 37:1155–1162.
- Wenger JA, Cassone BJ, Legeai F, Johnston JS, Bansal R, et al. 2020. Whole genome sequence of the soybean aphid, Aphis glycines. Insect Biochem Mol Biol. 123:102917.

Communicating editor: S. Scofield