

ARTICLE

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Analysis of the bread wheat genome using whole-genome shotgun sequencing

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Bread wheat (*Triticum aestivum*) is a globally important crop, accounting for 20 per cent of the calories consumed by humans. Major efforts are underway worldwide to increase wheat production by extending genetic diversity and analysing key traits, and genomic resources can accelerate progress. But so far the very large size and polyploid complexity of the bread wheat genome have been substantial barriers to genome analysis. Here we report the sequencing of its large, 17-gigabase-pair, hexaploid genome using 454 pyrosequencing, and comparison of this with the sequences of diploid ancestral and progenitor genomes. We identified between 94,000 and 96,000 genes, and assigned two-thirds to the three component genomes (A, B and D) of hexaploid wheat. High-resolution synteny maps identified many small disruptions to conserved gene order. We show that the hexaploid genome is highly dynamic, with significant loss of gene family members on polyploidization and domestication, and an abundance of gene fragments. Several classes of genes involved in energy harvesting, metabolism and growth are among expanded gene families that could be associated with crop productivity. Our analyses, coupled with the identification of extensive genetic variation, provide a resource for accelerating gene discovery and improving this major crop.

With a global output of 681 million tonnes in 2011¹, bread wheat accounts for 20% of the calories consumed by humans² and is an important source of protein, vitamins and minerals. It originated from hybridization between cultivated tetraploid emmer wheat (AABB, *Triticum dicoccoides*) and diploid goat grass (DD, *Aegilops tauschii*) approximately 8,000 years ago³. Bread wheat cultivation and domestication has been directly associated with the spread of agriculture and settled societies, and it is now one of the most widely cultivated crops owing to its high yields and nutritional and processing qualities. The three diploid progenitor genomes, AA from *Triticum urartu*, BB from a species that is unknown but which may be of the section *Sitopsis* (to which *Aegilops speltoides* belongs), and DD from *Ae. tauschii*, radiated from a common Triticeae ancestor between 2.5 and 4.5 million years ago, and AABB tetraploids arose less than 0.5 million years ago^{4,5}. Nucleotide diversity in the AABB and DD genomes is substantially reduced compared with ancestral populations, indicating a major diversity bottleneck on the transition to cultivated lines⁶.

Grass genomes show extensive long-range conservation of gene order^{7–9}. Nevertheless, they are highly dynamic owing to the activities of repeats that contribute to tremendous variation in genome size¹⁰, changes in local gene order and pseudogene formation, particularly in larger genomes such as those of maize¹¹ and wheat¹². From analysis of BAC contigs on chromosome 3B, the 17-gigabase-pair (Gb) genome was estimated to be composed of approximately 80% repeats, primarily retroelements, with a gene density of between 1 per 87 kilobase pairs and 1 per 184 kilobase pairs¹³. Despite both the substantial knowledge gained of the wheat genome from these studies and the central importance of the wheat crop, a comprehensive genome-wide

analysis of gene content has yet to be conducted owing to its large size, repeat content and polyploid complexity.

We have analysed a low-coverage, long-read (454) shotgun sequence of the hexaploid wheat genome using gene sequences from diverse grasses. From this, we created assemblies of wheat genes in an orthologous gene family framework, used diploid wheat relatives to classify homeologous relationships, and defined a genome-wide catalogue of single nucleotide polymorphisms (SNPs) in the A, B and D genomes. These analyses provide a foundation for genetic and genomic analysis of this key crop.

Sequence analysis

The wheat variety Chinese Spring (CS42) was selected for sequencing because of its wide use in genome studies^{14,15}. Purified nuclear DNA was sequenced using Roche 454 pyrosequencing technology (GS FLX Titanium and GS FLX+ platforms) to generate 85 Gb of sequence (220 million reads), corresponding to approximately five-fold coverage on the basis of an estimated genome size of 17 Gb. Supplementary Table 1 shows that 79% of the reads had matches to the Triticeae Repeat Sequence Database, and most hit retrotransposons, consistent with previous studies¹³. To identify A-, B- and D-genome-derived gene assemblies in the hexaploid sequences, we used Illumina sequence assemblies of *Triticum monococcum*, related to the A-genome donor, *Ae. speltoides* complementary DNA (cDNA) assemblies and 454 sequences from the D-genome donor *Ae. tauschii*, respectively. The SOLiD platform was used to generate additional sequence of CS42 and three commercial wheat varieties to increase the accuracy of homeologous SNP identification. Data sets are summarized in Table 1 and Supplementary Table 2, and SNP

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Table 1 | Sequence sources used for analysis

Genome	Platform	Size of data set	Reference
<i>T. aestivum</i> (CS42) genomic DNA	454 GS FLX Titanium/454 GS FLX+	85 Gb	EBI study: ERP000319
<i>T. aestivum</i> (CS42) genomic DNA from sorted chromosomes 1A, 1B and 1D	454 GS FLX Titanium	1A: 287 Mb 1B: 392 Mb 1D: 375 Mb	Ref. 12
<i>T. aestivum</i> (CS42, Avalon, Rialto, Savannah) genomic DNA	SOLiD 3/SOLiD 4	15.2 billion reads	EBI study: ERP001493
<i>T. aestivum</i> (CS42) cDNA	454 GS FLX Titanium/454 GS FLX+	1.6 Gb	EBI study: ERP001415
<i>T. monococcum</i> genomic DNA	Illumina GAIIx/HiSeq	A/B/D sequences: 3.7 Gb A/B/D SNPs: 401 Gb	NCBI archive: SRP004490.3
<i>Ae. speltooides</i> cDNA	Pre-assembled data	151 Mb	M. Trick and I. Bancroft, unpublished observations
<i>Ae. tauschii</i> genomic DNA	454 GS FLX Titanium	12.8 Gb	M.-C.L. et al., submitted
<i>Ae. tauschii</i> genomic DNA	SOLiD 4	80–100-fold coverage	J. Dvorak, unpublished observations

EBI, European Bioinformatics Institute; NCBI, US National Center for Biotechnology Information.

identification methods are described in Supplementary Information, section 5.2.

Sequence assembly

An orthologous group assembly (Supplementary Table 3) was created by clustering 454 reads by sequence similarity to orthologous grass gene sequences, and separate assembly of the clusters at high stringency using Newbler (Supplementary Information, section 2). The orthologous genes were derived from rice¹⁶, sorghum⁸, *Brachypodium*⁹ and barley full-length cDNAs by OrthoMCL¹⁷ clustering. This generated 20,496 orthologous groups (Supplementary Table 4 and Supplementary Fig. 1). The gene model with highest similarity to wheat (termed the orthologous group representative (OGR)) was selected from each orthologous group by stringent BLASTX comparison to a low-copy-number genome assembly (LCG) made by filtering out repetitive sequences and assembling the remaining low-copy-number sequences *de novo* (Supplementary Table 3). The assemblies are described in Table 2. Nearly 90% of the metabolic genes in *Arabidopsis* matched OGRs, and the 20,051 OGRs matched 92% of publicly available wheat full-length cDNAs¹⁸ and 78.7% of the harvEST set of wheat cDNA assemblies (Supplementary Fig. 2), indicating that they represent nearly all wheat genes.

We optimized parameters for wheat gene assembly using MetaSim¹⁹ to generate simulated fivefold 454 reads from the allotetraploid maize genome and from a triplicated rice gene set, with the introduction of sequence variation (Supplementary Information, section 2.7). Similar degrees of coverage over the OGRs were seen for the simulated data sets and wheat 454 reads (Fig. 1a). Rice reads followed the same depth distribution as the wheat reads (Fig. 1b), suggesting that they are a reasonable representation of hexaploid sequences. Maize reads covered their OGRs to a median depth of approximately five, consistent with fivefold coverage.

Simulated maize and triplicated rice 454 reads were used to optimize assembly parameters. Assembly at 99% minimum sequence identity (m.i.) using 40-bp overlap length predicted gene family sizes most accurately (Supplementary Figs 3–6). Wheat 454 reads were pre-processed (Supplementary Table 5) and assembled using 99% m.i. (Supplementary Tables 6 and 7) to create the orthologous group assembly. Figure 1b shows that the depth of coverage of the orthologous group assembly followed a similar pattern to maize, consistent

with multiple gene copies. In contrast, the low depth coverage by the LCG assembly suggested that gene family numbers were collapsed. The number of wheat assemblies for each OGR was calculated to determine gene copy numbers (Supplementary Table 7). Figure 1c shows that most OGRs had between one and five distinctive wheat gene assemblies, with a peak of two genes.

The A, B and *Ae. tauschii* (D) genomes^{13,20,21} have been estimated to contain approximately 28,000, 38,000 and 36,000 genes, respectively. We estimated the number of genes in the hexaploid wheat genome to range between 94,000 and 96,000 (Supplementary Information, section 2.10). This is reasonably consistent with estimates based on wheat chromosome sequences¹³. Comparing our transcriptome assembly (Supplementary Information, sections 2.8 and 2.9) and wheat harvEST with the wheat OGRs showed that 76% and, respectively, 65% were expressed under the conditions used for RNA isolation. Similar results were found in barley²², rice¹⁶ and maize²³, indicating that the assemblies are bona fide wheat genes.

We defined the overall extent of gene conservation between wheat and the most closely related sequenced pooid grass, *Brachypodium distachyon*^{9,24}. Track 1 of Fig. 2 shows that there is a high degree of overlap between the gene sets of *Brachypodium* and wheat, but with regions of lower conservation, for example on *Brachypodium* chromosomes 1 and 4. Syntenic maps of the *Brachypodium* genome and the A-, B- and D-chromosome groups were created by integrating high-density wheat EST-based markers²⁵ with *Brachypodium* genes (Fig. 2, tracks 5, 6 and 7, respectively). Supplementary Fig. 7 shows the A-, B- and D-genome markers separately. Syntenic alignments were readily identifiable and conformed to the predicted major patterns^{9,26}. We identified many insertions and/or translocations of blocks of genes within the overall conserved patterns of gene order, including the major rearrangement on chromosome 4A as shown on *Brachypodium* chromosome 1 (ref. 20). Lower marker density on the D genome is evident in track 7. The higher-resolution genetic map identified a new syntenic alignment of Triticeae group 5 to *Brachypodium* chromosome 3 genes.

Genome change in polyploid wheat

We determined the influence of polyploidy on gene content in hexaploid wheat by defining the sizes of gene families in hexaploid wheat and the diploid progenitor *Ae. tauschii* from the copy number of genes

Table 2 | Assembly statistics of the orthologous group assembly, the LCG and cDNA assemblies

	Orthologous group assembly* (99% m.i.)	LCG†	cDNA assembly†
Number of sequences	949,279	5,321,847	97,481
Total sequence (bp)	437,512,281	3,800,325,216	93,340,842
Minimum length; maximum length (bp)	79; 7,312	100; 21,721	100; 10,382
N10; N50; N90 (bp)	766; 481; 331	2,234; 884; 420	2,707; 1,325; 509
Mean length (bp)	460.89	714.10	957.53
GC content (%)	48.25	47.69	47.74

* Combined set of 454 sequences that cluster and form contigs and 454 sequences that remain singletons.

† Set of 454 sequences that cluster and form contigs.

bp, base pair.

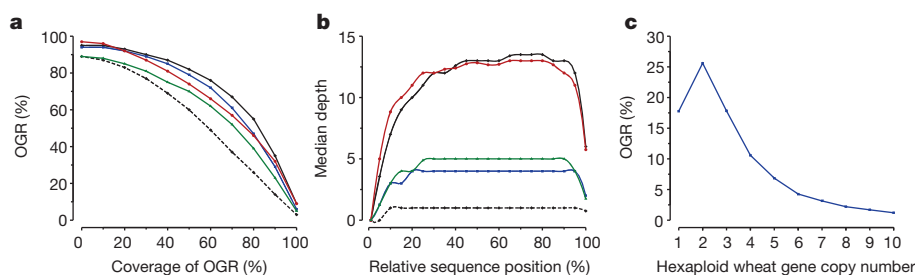


Figure 1 | Coverage of OGRs by wheat 454 sequence reads and simulated 454 reads from rice and maize. **a**, Coverage of OGRs by repeat-masked wheat 454 sequence reads (black line), wheat LCG (black dashed line) and the orthologous group assembly (blue line), together with rice genes (red line) and maize simulated reads (green line). **b**, Median coverage depth over protein-

coding regions of OGRs (amino terminus = 0; carboxy terminus = 100). The colour coding is the same as in **a**, except simulated hexaploid reads from rice (red line) were used. **c**, Distribution of wheat gene copy numbers from the orthologous group assembly.

for each OGR, which were then paired with the gene family size of the OGR in sequenced diploid grasses (Supplementary Information, section 2.6). The mean family size was 1.4 members. Supplementary Fig. 8 shows relationships between wheat and diploid orthologous gene family across the full scale of orthologous gene family sizes. This approach accurately reconstructed gene family sizes in simulated maize and 'hexaploid' rice genomes (Figs 3a, b), although larger gene

family sizes tended to be underestimated. Figure 3c, d shows the relationships between *Ae. tauschii* and wheat genes. Single-member gene families in hexaploid wheat and *Ae. tauschii* were maintained to a similar extent as those seen in sequenced diploid grasses, consistent with Southern blot analyses of single-copy genes²⁷. Using the D genome as a diploid reference, we calculated the Triticeae hexaploid/diploid gene family size ratio to be between 2.5:1 and 2.7:1, derived from the geometric mean (2.5:1) and the slopes of the blue line and the red line (2.7:1) in Fig. 3e. Comparing this with the expected hexaploid/diploid ratio of 3:1 indicates the loss of between 10,000 and 16,000 genes in hexaploid wheat compared with the three diploid progenitors (Supplementary Information, section 2.10). This is consistent with earlier studies of gene loss in newly synthesized wheat polyploids²⁸ and the erosion of genetic diversity during wheat domestication⁶.

Despite this overall trend of gene family size reduction, gene families with fewer or more members than expected were identified in *Ae. tauschii* and hexaploid wheat, as shown by green dots (more members) and brown dots (fewer members) in Fig. 3c (*Ae. tauschii*) and Fig. 3d (hexaploid wheat). Supplementary Tables 10–12 show the over- and under-represented functional categories of protein. Most of the over-represented categories in expanded gene families are common to wheat and *Ae. tauschii*: these include ribosome proteins, components of photosystem II, storage proteins, transposon-related proteins, cytochrome P450s, NB-ARC domain proteins involved in defence responses, proteins related to pollen allergens and F-box proteins. Five of the eleven families encoding hydrogen ion transmembrane transporters were significantly more numerous in *Ae. tauschii* than in wheat. Analysis of gene families (Supplementary Fig. 9) showed that they encode different subunits of ATPases. We speculate that they may provide proton gradients to support Na^+ exclusion in *Ae. tauschii*²⁹ and the accumulation of minerals in other *Aegilops* species³⁰.

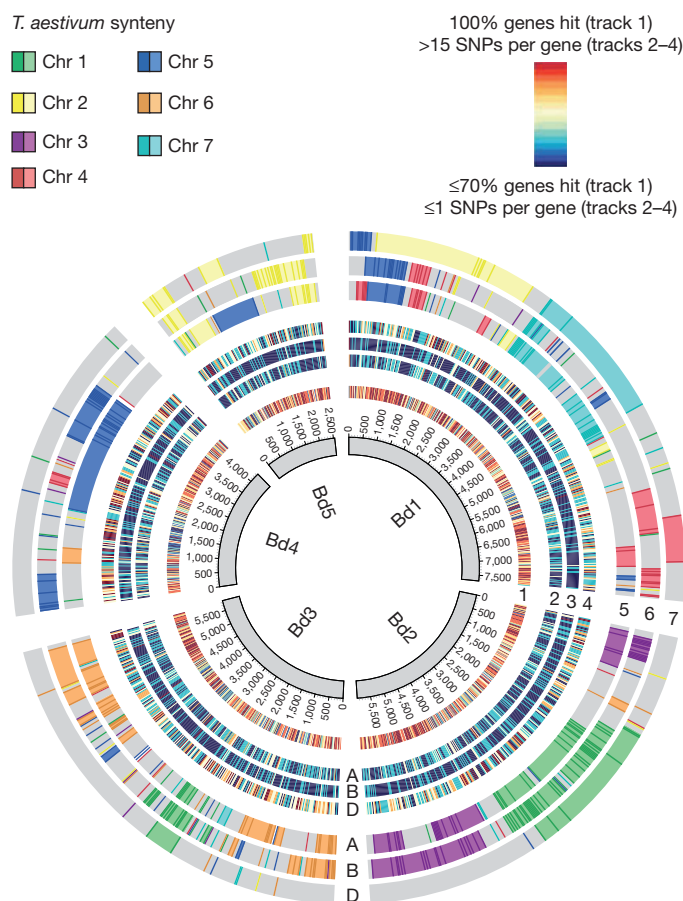


Figure 2 | Alignment of wheat 454 reads, SNPs and genetic maps to the *B. distachyon* genome. The inner circle represent gene order on the five *Brachypodium* chromosomes (Bd1–Bd5). Track 1 illustrates conservation between wheat 454 reads and *Brachypodium* genes, shown as a window of genes present in wheat. Tracks 2–4 show SNP density (the mean number of SNPs per gene in a window of 20 genes) in the A (track 2), B (track 3) and D (track 4) genomes of wheat. Tracks 5–7 show wheat synteny with *Brachypodium* for the A (track 5), B (track 6) and D (track 7) genomes. Genetic markers²⁵ (shown in darker colours) are colour-coded by wheat chromosome. Gaps between markers are filled in to show synteny (lighter colours).

Pseudogene analysis

Several classes of plant DNA transposons^{31,32} and retroelements³³ create and amplify gene fragments, disrupt genes and create pseudogenes, which can influence gene expression through epigenetic mechanisms³⁴. We identified a set of almost 233,000 gene fragments that mapped to the same regions of their OGRs, forming 'stacks' that were sufficiently divergent not to assemble into their cognate gene assemblies (Fig. 4a). Two classes were identified: those containing Pfam domains and those aligning with non-Pfam domains of OGRs. Nearly 30% of the OGRs had associated gene fragments (Supplementary Table 13) that most frequently covered between 5 and 15% of the OGR length (Fig. 4b). Figure 4c shows that the alignment identities of gene fragments against their OGRs were substantially lower than the identities of cognate regions within wheat gene assemblies. Supplementary Fig. 10 shows the distribution of stacks along genes and the ratio of non-synonymous to synonymous substitutions (K_a/K_s) along the genes. Pfam domains found in stacks were enriched for zinc-finger motifs in mutator transposons (Supplementary Table 14), consistent

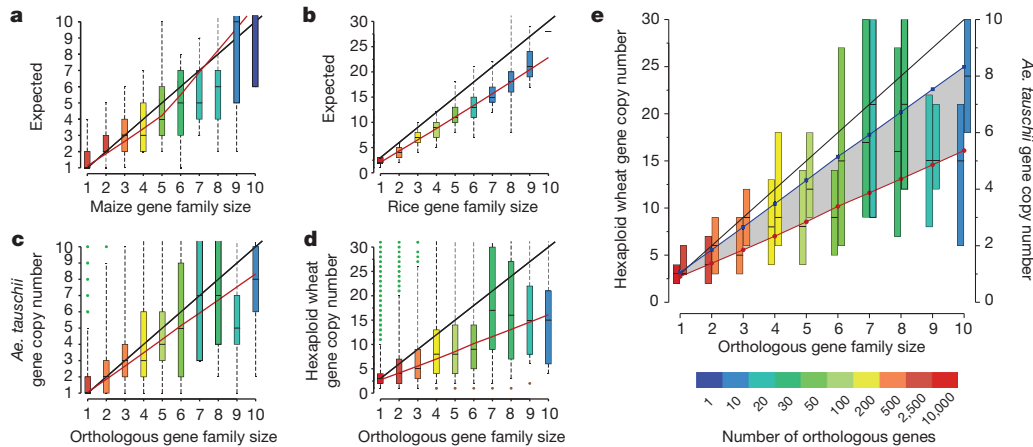


Figure 3 | Gene family sizes in orthologous assemblies of hexaploid wheat, *Ae. tauschii*, simulated maize and hexaploid rice. The boxes and whiskers contain 50% and 90% of the orthologous group assembly genes, respectively. The box colours indicate the number of genes in diploid gene families of different sizes. The black lines represent expected gene family sizes, and the red lines show the gene family sizes determined from the orthologous group assembly, derived by polynomial regression fit. Only gene families with up to ten members are shown. **a**, Maize gene family sizes predicted from orthologous assembly of simulated 454 reads. **b**, Rice gene family sizes predicted from orthologous assembly of simulated 454 reads derived from triplicated rice

with their role in pseudogene formation³¹. F-box, protein kinase and NB-ARC domains, which are found in the most rapidly evolving gene families in plants^{9,35}, are also over-represented.

Determining homeologous relationships of gene assemblies

We classified gene assemblies as A-, B- or D-genome-derived according to sequence similarity to Illumina sequence assemblies from *T. monococtum*, cDNA assemblies from *Ae. speltoides* and, respectively, 454 reads from *Ae. tauschii* by applying a support vector machine learning approach (Supplementary Section 5, Supplementary Figs 11 and 12, and Supplementary Tables 15–18). Supplementary Fig. 13 shows that 66% of the gene assemblies were classified with high overall precision (>70%) and recall into the A genome (28.3%), the B genome (29.2%) and the D genome (33.8%). The other 9% of classified assemblies have stop codons. The other 34% with low classification probabilities are likely to be very similar homeologues. Comparison with a subset of A-, B- and D-genome SNPs confirmed 72% of A-genome classifications and 85% of D-genome classifications (Fig. 2 and Supplementary Table 19). Discrimination of putative B-genome genes was only ~60%, possibly owing both to the use of cDNA sequences for classification when most of the informative sequence polymorphisms are intronic, and to uncertainty about the

ancestry of the B genome⁵. The set of 132,552 SNPs allocated to the A, B and D genomes is displayed using *Brachypodium* as a template in tracks 2–4 of Fig. 2.

There were no significant differences between the respective distributions of GO Slim molecular function categories in the A, B and D genes (Supplementary Fig. 14), indicating that at this level of functional categorization there is no biased gene loss³⁶ in any of the genomes. Nevertheless, analysis of GO Slim terms associated with stop codons in A, B and D gene assemblies showed that there was a strong tendency to retain functional copies of genes encoding transcription factors in all three genomes (Supplementary Fig. 15), similar to the preferential retention of these genes in *Arabidopsis* genome duplications³⁷. This indicates that genome-specific transcriptional regulatory networks tend to be maintained in wheat.

Conclusions

Using whole-genome 454 sequencing, we assembled gene sequences representing an essentially complete gene set, and a significant number were assigned to the A, B or D genome. Although the assemblies are fragmentary, they form a powerful framework for identifying genes, accelerating further genome sequencing and facilitating genome-scale analyses. The identification of over 132,000 SNPs in A, B and D genes facilitates analysis of quantitative trait loci and association studies of

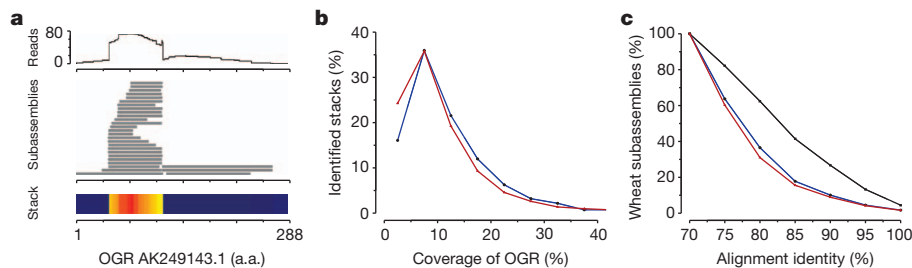


Figure 4 | Pseudogene identification and analysis. **a**, Visualization of an OGR and associated wheat sequences. The top track shows the hit count profile of mapped 454 reads. The lower tracks show subassemblies of three wheat genes and a stacked region of gene fragments. Read depth is represented by the heat map. **b**, Coverage of the OGR by Pfam-containing gene fragments and

pseudogenes. The blue and red lines represent stacks with and without protein domains, respectively. **c**, Protein identity between subassemblies forming stacks of gene fragments. The blue and red lines represent stacks with and without protein domains, respectively, and the black line represents subassemblies forming genes.

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Supplementary Information is available in the online version of the paper.

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Author Information Sequence assemblies have been submitted to the European Nucleotide Archive under project accession number PRJEB568. Reprints and permissions information is available at www.nature.com/reprints. The authors declare competing financial interests: details are available in the online version of the paper. Readers are welcome to comment on the online version of the paper. Correspondence and requests for materials should be addressed to M.W.B. (michael.bevan@jic.ac.uk), K.F.X.M. (k.mayer@helmholtz-muenchen.de), N. Hall (Neil.Hall@liverpool.ac.uk), A. H. (Anthony.Hall@liverpool.ac.uk), or K.J.E. (k.j.edwards@bristol.ac.uk). This work is licensed under a Creative Commons Attribution-NonCommercial-ShareAlike 3.0 Unported licence. To view a copy of this licence, visit <http://creativecommons.org/licenses/by-nc-sa/3.0/>