

Genomic innovation for crop improvement

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Crop production needs to increase to secure future food supplies, while reducing its impact on ecosystems. Detailed characterization of plant genomes and genetic diversity is crucial for meeting these challenges. Advances in genome sequencing and assembly are being used to access the large and complex genomes of crops and their wild relatives. These have helped to identify a wide spectrum of genetic variation and permitted the association of genetic diversity with diverse agronomic phenotypes. In combination with improved and automated phenotyping assays and functional genomic studies, genomics is providing new foundations for crop-breeding systems.

In the twentieth century, famines caused by political crises, mismanagement of food production or genocide killed an estimated 70 million people and were second only to war as the greatest man-made cause of death¹. The father of the Green Revolution, Norman Borlaug, summarized the importance of crops: “Without food, people perish, social and political organizations disintegrate, and civilizations collapse.” For thousands of years, people have dedicated considerable resources to securing food supplies; for example, grain supplies to ancient Rome were secured through an extensive network of long-distance transport, and the distribution of grain was coordinated and subsidized by the *cura annonae* (‘care for the grain supply’), an important figure who contributed to the maintenance of political unity and power.

During the past 10,000 years, a period known as the Holocene, Earth’s environment has been unusually stable. This probably facilitated the domestication of crops from wild species, resulting in steadily improved yields and adaptation to new agricultural areas. The production of food is now carried out on a vast scale, with 38% of Earth’s surface dedicated to agriculture². This increased production is having a pervasive influence on ecosystems worldwide: nitrogen production for agriculture accounts for 1.2% of global energy consumption³; photosynthesis can no longer maintain stable levels of atmospheric carbon dioxide; and food production consumes around 70% of freshwater supplies. The modelling of crop responses to increases in temperature predicts that there will be a considerable reduction in the yield of rice, an important crop around the world⁴. Climate change could also alter the dynamics of crop pathogenic agents by altering the range of vectors and by compromising the immune response of crops⁵.

Crop production must therefore adapt to more variable environments and the substantial impact it has on the environment needs to be reduced. Productivity must also increase at a much greater rate than in the past to meet the needs of Earth’s growing population⁶. Genetic improvements in crop performance continue to be crucial for increasing crop productivity, but current rates of improvement are unable to meet the demands of sustainability and food security⁷. Plant genomics has a central role in the improvement of crops, including discovery of genetic variation that underlies enhancing performance and increasing the efficiency of plant breeding. Both approaches are important owing to the long lead time for breeding new varieties and the need to identify new sources of genetic variation. In this Review, we describe advances in genome sequencing and assembly technologies and explain how these

can be applied accurately to assemble large and complex crop genomes, as well as to access genetic diversity on an unprecedented scale. These genomic data are enabling key steps in crop improvement, such as trait identification and alteration, the breeding process and performance optimization, which can now be considered as DNA sequence analysis problems. We also show how advances in genomic and computational biology can address bottlenecks in crop improvement and make important contributions to food security.

Crop plant genomes

The extraordinary diversity of plant species is reflected in their genomes, which vary greatly in size and complexity⁸. Dramatic increases in genome size, notably in the grasses, are driven by bursts of DNA-repeat expansion that tend to preserve an underlying conserved order and composition of genes⁹. DNA repeats have an important role in generating phenotypic diversity and plants have evolved epigenetic mechanisms to limit the parasitic expansion of such repeats^{10,11}. The other dominant feature of plant genome evolution is whole-genome duplication (see Box 1 for a definition of this and other terms that are used in crop improvement), which is pervasive in most plant lineages¹². Whole-genome duplication can lead to aneuploidy, asymmetric genome evolution¹³, the rapid loss of genes, exchange between chromosomes and new gene functions, and is therefore an important driver of genetic and phenotypic diversity and adaptation. Many crops are hybrids that have been domesticated from naturally occurring polyploids or generated by breeding programmes. Figure 1 highlights the roles that genome duplication has played in the formation of the complex genomes of two major crops, wheat (*Triticum* spp.) and members of the genus *Brassica*. The large genome sizes, long tracts of related repeat sequences and the closely related homeologous genes in the large gene families of polyploid crops have presented considerable challenges for sequencing technologies. Assembling accurate and representative genomes and assessing the full range of available genetic variation are therefore central aims for crop plant genomics.

DNA sequencing and assembly technologies

Several strategies have been adopted for the sequencing and assembly of large polyploid genomes of crops. One such approach involves the reduction of genome complexity. Although the massive 22 gigabase (Gb) genome of the loblolly pine (*Pinus taeda* L.) is highly heterozygous, the

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reduced haploid genome of tissues that give rise to the germ line (the gametophyte) of the tree has been successfully sequenced and assembled¹⁴. A second approach involves the sequencing of diploid progenitor species. For example, strawberry (*Fragaria × ananassa*) is an octoploid that formed from four diploid progenitors. To access the genetic diversity of this valuable crop, a diploid variety of *F. vesca* was sequenced¹⁵. Oilseed rape or canola (*Brassica napus*) is an allopolyploid that formed from two diploid species of *Brassica* that are triplicated versions of an ancestral diploid (Fig. 1). Genome assemblies of *B. napus* were assigned to these two subgenomes using sequence assemblies from each diploid progenitor, but many sequence scaffolds showed ambiguous assignment to homeologous groups, owing to homeologue exchange and frequent gene loss¹⁶. A similar strategy was used to characterize the allotetraploid genome of the peanut (*Arachis hypogaea*), which formed from two diploid species. Essentially complete assemblies of the genomes of the probable progenitor species *A. duranensis* (1.2 Gb) and *A. ipanensis* (1.5 Gb) were generated and shown to directly align with the genetic map of a cultivated tetraploid peanut¹⁷. Molecule synthetic long-read sequencing¹⁸ of the tetraploid peanut genome showed that it was 98–99% identical to the diploid genomes, with differences due to recombination between the subgenomes. A third approach to the deconvolution of polyploid genomes involves the sequencing of DNA from purified chromosome arms. This was applied to the large allohexaploid genome of bread wheat, in which the independently maintained A, B and D genomes can tolerate the loss of entire chromosomes. Chromosomes from wheat lines

that had lost an entire chromosome arm were flow-sorted to purify the small remaining chromosome arm¹⁹. Sequencing of the chromosome-arm DNA enabled the precise allocation of most genes to the closely related A, B or D genomes²⁰.

There are several examples of the successful *de novo* sequencing and assembly of large allopolyploid genomes of crops that use long-range alignments of sequence scaffolds to generate extended haplotypes that form distinctive homeologous pseudomolecules. Tobacco (*Nicotiana tabacum*; $2n = 4 \times = 48$) is an allotetraploid that is derived from the diploid genomes of *N. sylvestris* and *N. tomentosiformis*. Whole-genome shotgun assemblies were aligned to physical maps to create long super scaffolds that could be assigned directly to the progenitor genomes²¹. Upland cotton (*Gossypium hirsutum*) is an allotetraploid that formed 1–2 Myr ago from two unknown diploid species. The genome complexity of upland cotton was reduced by sequencing allohaploid lines that were derived by pollen culture to a depth of coverage of 245× with Illumina short-read sequencing reads²². A dense genetic map was used to align and correct the scaffolds, which covered 96% of the estimated 2.5 Gb genome, and fluorescence *in situ* hybridization was used to confirm a successful allotetraploid assembly. The polyploid genome of Indian mustard (*B. juncea*) (Fig. 1) has been sequenced using a combination of Illumina short reads and PacBio single molecule, real-time long sequence reads that were aligned with optical maps from BioNano Genomics²³, which directly visualize individual molecules of tagged DNA, and dense genetic maps²⁴. The genome was almost fully

BOX 1

Glossary

Terms that are used to describe genomic methods, genetic analyses and their application in crop genomic studies and improvement are briefly explained.

- **Allopolyploid** A polyploid that contains sets of chromosomes that are derived from two distinctive parents; compared with an autopolyploid, in which the chromosomes are derived from one parent.
- **Amphidiploid** A plant that has a complete set of diploid chromosomes from each parent.
- **Breeding programme** The targeted interbreeding of plant varieties and the selection of progeny with improved characteristics. Almost all crops have a long history of such genetic improvement.
- **Bread wheat** *Triticum aestivum*, a hexaploid that is composed of three sets of homeologous chromosomes from closely related grasses. Its grain produces a flour that when mixed with water forms a viscoelastic dough that is suitable for bread production.
- **Doubled haploid** In plant breeding, loci can be made homozygous by cultivating haploid anther cells and doubling their chromosome number by treatment with colchicine.
- **Emmer wheat** *Triticum turgidum dicocum*, or hulled wheat, is a tetraploid wheat that was domesticated in the Near East and is a widely grown crop.
- **Genetic association** A method for associating genetic variation with a phenotype that uses linkage disequilibrium to identify sets of sequence polymorphisms that statistically co-occur with a given phenotype.
- **Genetic gain** The change in performance of breeding populations owing to the recurrent selection of plants with higher performance.
- **Haplotype** A co-inherited block of DNA that contains several genes with a defined order, or phasing, of sequence polymorphisms.
- **Homeologue** In polyploid cells, chromosomes that are derived from one parent are called homologues and they pair during meiosis. Homeologous chromosomes are related chromosomes from

one parent that, in general, do not pair with chromosomes from the other parent.

- **Hybrid** The offspring of two distinctive parents. Hybrid offspring can have increased vigour in comparison to each parent.
- **Introgression** The introduction of a chromosome or part of a chromosome from one species into another by the production of an interspecific hybrid and repeated backcrossing to one parent to remove undesired chromosomes.
- **N50** A widely-used measure of the extent of sequence assembly. The value refers to the shortest sequence length at which 50% of the bases in the assembly are represented.
- **Near-isogenic line** Used to establish, through repeated backcrossing, a population of plants with a common genetic background that contains chromosomal regions from another plant that confer specific traits.
- **Polyploid** An organism that contains more than two pairs of homologous (pairing) chromosomes.
- **Pseudomolecule** An ordered concatenation of separate sequence scaffolds that forms a representation of the sequence of a chromosome or chromosome arm. In general, a high-density genetic map is used to achieve ordering but, more recently, chromatin proximity ligation sequence data or optical maps have been applied.
- **Quantitative trait locus** A region of a chromosome (locus) that is mapped to underlie a specific continuously varying trait. Several genes can be found at the locus, only one of which may confer the trait.
- **Scaffold** An oriented array of DNA sequence assemblies that are generated from sequence contigs that contain regions of unknown sequence but known length, represented as tracts of n .
- **Super scaffold** A set of scaffolds that is anchored into a longer-range order that is provided by, for example, an optical map or chromatin proximity ligation data.
- **Whole-genome duplication** The full duplication and stable inheritance of chromosomes in an organism. Leads to autopolyploidy and occurs frequently in plants.

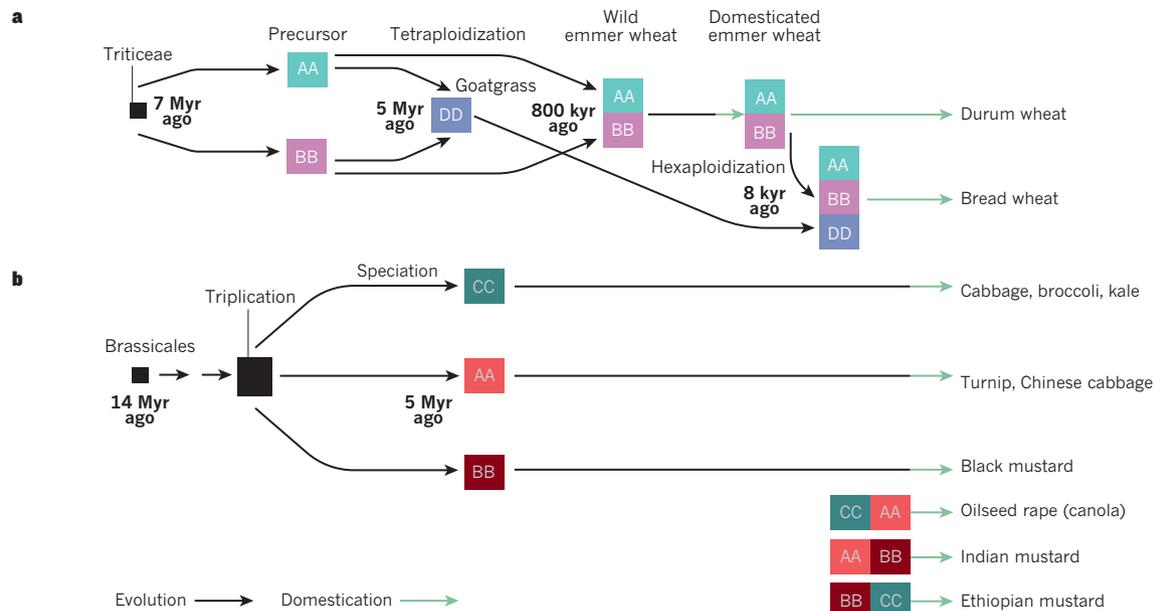


Figure 1 | Evolution and domestication of the common polyploid crops wheat and the genus *Brassica*. **a**, About 7 Myr ago, an ancestral Triticeae gave rise to the AA and BB diploid precursor genomes of wheat. These formed the diploid precursor DD genome of goatgrass 5 Myr ago. Around 800 kyr ago, the tetraploid AABB genome of wild emmer wheat formed, which was domesticated in the region that is now south-west Turkey. About 8 kyr ago, a random

hexaploidization event occurred between domesticated emmer wheat and a wild goatgrass, which contributed its DD genome, that formed the contemporary bread wheat genome. **b**, About 14 Myr ago, an ancestral Brassicales underwent genome triplication; it then speciated to form the AA, BB and CC genomes around 5 Myr ago. The resulting species were domesticated relatively recently and also formed polyploid species that are important crops worldwide.

represented in the assembly, which was assigned to the 402 megabase (Mb) A genome and the 547 Mb B genome.

Accurate and long-read sequencing

Advances in sequencing technology are being used to resolve complex genomic regions and to determine copy number variants in the human genome (reviewed in ref. 25) that are directly relevant to resolving polyploid crop-genome assemblies and to identifying structural variants. The most important advance has been the ability to capture maximal levels of sequence variation in assemblies so that low levels of sequence polymorphism between closely related homeologues and repeats are represented in assemblies. Bias that is introduced by sequence template preparation can be reduced by making paired-end libraries without polymerase chain reaction (PCR) amplification steps²⁶. Variation can also be lost during the error-correction step of contig assembly. The DISCOVER *de novo* genome assembler²⁷ captures a wider range of sequence variation during assembly by preserving sequence differences in the assembly graph. A high-quality *de novo* assembly of the mosquito genome was accomplished by the DISCOVER assembly of a single paired-end PCR-free library²⁸. Another important advance has been the increase in the length of sequence reads. Single-molecule, real-time sequencing has dramatically improved the contiguity and repeat representation of mammalian²⁹ and large pine³⁰ and grass³¹ genomes. This has proved useful for the production of higher-quality plant-genome assemblies and has been applied to the *de novo* assembly of smaller plant genomes such as *Arabidopsis* and the grape vine *Vitis vinifera* cv. Cabernet Sauvignon³².

Nanopore single-molecule sequencing from Oxford Nanopore Technologies is an emerging method that could have considerable potential applications in crop genomics, including real-time selective sequencing, the identification of modified bases and in-field genomics analyses. However, this technology is at an early stage of development with respect to the sequencing of large genomes and has a fairly high rate of error. Initial nanopore-based genome assemblies used a hybrid approach with short-read Illumina sequences to correct such errors in nanopore yeast-genome assemblies^{33,34}. More recent progress has been rapid: for example, the 29× coverage of the *Escherichia coli* genome that was achieved with the long-read nanopore sequencing method

MinION was sufficient to generate a single 4.9 Mb contig of 99.5% accuracy³⁵.

Methods for linking sequences in genome assembly

A further requirement for the *de novo* assembly of polyploid plant genomes is the linking of sequence contigs into longer scaffolds and super-scaffolds while unambiguously separating very closely related chromosomes or haplotypes. Several complementary mapping approaches have been applied to the ordering of genome assemblies into longer super-scaffolds. Proximity ligation is a method that physically links segments of DNA that are in close proximity in chromatin by chemical cross-linking *in vivo*, which is followed by ligation of the adjacent DNA sequences and sequencing of the ligated regions. The proximity-based ligation of nuclear-chromatin preparations generates contact probability maps that link DNA sequence reads across megabase scales while identifying various chromosomal compartments and interactions^{36,37}. The HaploSeq method used proximity ligation coupled to low-coverage (17×) Illumina sequencing to generate extended haplotypes of the human genome³⁸. The allotetraploid genome of the African clawed frog (*Xenopus laevis*) was recently sequenced and organized using *in vitro* and *in vivo* chromatin conformation methods³⁷. This separated the two distinct genomes and identified an asymmetry in which one of the genomes experiences accelerated gene loss and rearrangements. *In vitro* reconstituted chromatin provided useful links across genomic distances of up to 500 kilobase (kb) and enabled very large scaffolds to be generated for the human and alligator genomes³⁹. The 1.4 Gb genome of quinoa (*Chenopodium quinoa*), a nutritious grain, has also been assembled⁴⁰ into very long scaffolds (90% of the genome represented by 439 scaffolds) by combining long reads, *in vitro* chromatin links and optical maps from BioNano Genomics.

Linked-read sequencing technology from 10x Genomics uses a microfluidics device to partition long DNA molecules (greater than 50 kb) into individual gel beads that contain a unique barcode consisting of a short sequence of DNA, a sequencing adaptor and semi-random priming sequences. Hundreds of thousands of individual library constructions and PCR reactions on DNA molecules can then be performed, pooled and sequenced using Illumina methods and deconvoluted into linked-read sequences from long, single molecules of DNA.

In essence, this approach integrates the throughput and accuracy of Illumina sequencing with multiplexed long single-molecule sequencing. When applied to the human genome, in a hybrid approach that uses linked reads to order and align a standard Illumina assembly, a 12-fold increase in scaffold N50 was achieved⁴¹. Linked-read technology has been used to generate contiguous 40–200 kb blocks of genomic variants in the correct order (phased) from trio DNA (collected from a mother, father and child), a cancer cell line and a primary tumour⁴². Inheritance patterns of genomic deletions and gene rearrangements were defined, and haplotype analyses found copy number variation in a mutation in a cancer-driver gene. Linked-read sequencing has also been used to generate separate haplotypes for diploid homologous chromosomes⁴³. Similarly, long reads performed using the PacBio platform coupled to the fast alignment and consensus for assembly (FALCON)-Unzip genome assembler have been used successfully to define large-scale haplotype-specific assemblies of *Arabidopsis* trios and *Vitis vinifera* cv. Cabernet Sauvignon, which is a highly heterozygous F₁ hybrid³².

Combined approaches to genome sequencing and assembly

The genomes of several commercially important polyploid crops could now be sequenced and assembled *de novo*, and a number of ongoing sequencing projects could be supplemented, by applying the genomics technologies we have described. Linked-read and single-molecule, real-time technologies can generate extended haplotypes that are specific to homologous chromosomes, which are used to efficiently detect large-scale genomic variation such as deletions, translocations and chromosome additions while preserving low levels of sequence variation in conserved repeats and genes.

Such approaches are important because they will establish a compendium of the multiple types of genetic variation that are required for crop improvement. Examples include the octaploid genome of strawberry. A doubled-haploid line of the highly heterozygous diploid genome of the robusta coffee plant (*Coffea canephora*; $2n = 2 \times = 22$) has been sequenced⁴⁴. It is one of the parents of the elite coffee plant *C. arabica*, the tetraploid genome of which has yet to be sequenced. The banana (*Musa* spp.) has a particularly complex polyploid breeding system. A doubled-haploid line of banana (*M. acuminata*) has been sequenced⁴⁵, assembled and integrated into 11 linkage groups. Most modern cultivars are sterile triploids that are composed of AAA genomes (Cavendish bananas, *M. acuminata*) or AAB genomes (plantains, *M. acuminata* × *M. balbisiana*). A hexaploid wheat whole-genome shotgun assembly has been built from short-insert (250 base pair (bp)) paired-end Illumina reads and long-insert mate-pair libraries using a new variation-aware contig assembler called w2rap⁴⁶. The sequence assemblies were accurately assigned to the A, B and D genomes, and almost 14 Gb of the 17 Gb genome was represented.

Sugar cane is vegetatively propagated from hybrids of the high-sugar variety *Saccharum officinarum* ($2n = 80 \times = 10$) and its vigorous wild relative *S. spontaneum* ($2n = 40-128 \times = 8$): *S. spontaneum* is backcrossed to *S. officinarum* and the offspring are selected for their sugar content. Modern cultivars have $2n = 100-130$ chromosomes, which are often recombined or lost. This exceptionally complex polyploid aneuploid genome can be thought of as being composed of multiple variant copies of the closely related *Sorghum* genome⁴⁷. To assess genetic diversity between related chromosomes and to identify lines for optimal crosses, linked-read technologies could be applied to generate a number of haplotypes that are aligned to the *Sorghum* 'baseline' genome. This method would identify copy number variation and rearrangements, as well as provide a foundation for the development of DNA sequence markers for selecting desired genomic regions that would help to achieve the yield potential of sugar cane, a crop of importance worldwide.

Forage grasses (*Lolium* spp. and *Festuca* spp.) are the foundation of dairy and meat production. Perennial ryegrass (*L. perenne*) is self-incompatible and is maintained as highly heterozygous diploid or tetraploid genomes. Current *Lolium* genome resources⁴⁸ come from a homozygous inbred line. The application of new sequencing

technologies to highly heterozygous commercial diploid or tetraploid lines, as well as amphidiploid introgressed lines, will enable a much broader range of genetic variation to be identified for use in improving these crucial crops. Various methods of sequencing are available for use in the analysis of crop genomes (Fig. 2). The approach that is most suitable will depend on the number and coverage of genomes needed for the study, as well as cost considerations.

Domestication erodes genetic diversity

Widespread archaeological evidence has identified relationships between crop domestication and the settled agriculture that formed part of the Neolithic revolution⁴⁹. The domestication of species occurred at the geographical centres of their genetic diversity, an observation made first by Nikolai Vavilov⁵⁰. Examples of this include: maize and squashes in Central America; potatoes and tomatoes in the Andean region of South America; coffee in Yemen and Ethiopia; oil palm and millets in West Africa; rice, citrus fruits and sugar cane in southeast Asia; and barley and wheat in an arc called the Fertile Crescent that extends from Israel to northern Iran and central Asia.

Crop domestication involved the identification of species of plants with desirable traits, followed by the deliberate cultivation and progressive selection, often over thousands of years, of a limited range of plant types for improved adaptation to settled cultivation, growing conditions and the needs of people (Fig. 3a). Recurrent selection has increased the frequency of desirable traits such as improved management (for example, harvest traits such as non-shattering grain, which keeps the seed in the flower spike so that it is not lost) and enriched characteristics such as greater nutritional value, flavour and yield; it has also reduced the frequency of undesirable traits such as toxicity, low palatability and poor adaptation to agricultural environments. Genome analyses of rice, maize and wheat, which are globally important grass crops, demonstrate how

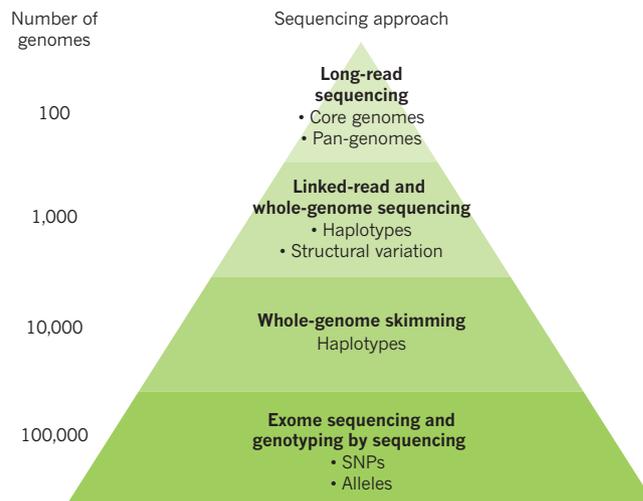


Figure 2 | Optimal sequencing systems for crop applications. A variety of sequencing methods are now available for different applications in crop improvement (green pyramid). The number of genomes that can be sequenced cost-effectively varies according to the method applied (left). Long-read technologies from PacBio, alone or coupled with Illumina assemblies, can be used to provide accurate long-range assemblies for a smaller number of genomes. These are used to define comprehensively the range and types of variation that are found in the genomes of a species (the pan-genome). Linked reads, coupled to Illumina sequencing, may provide more cost-effective capacity for sequencing on the order of thousands of genomes, which is useful, for example, for the identification of structural variation. Skim sequencing consists of low-coverage (for example, 5–10×) Illumina reads and presents a cost-effective way of identifying genetic variation and haplotypes in populations. Exome sequencing captures gene-coding regions, and genotyping by sequencing typically involves the sequencing of about 100–150 bases from a randomly located restriction-enzyme cleavage site in the genome.

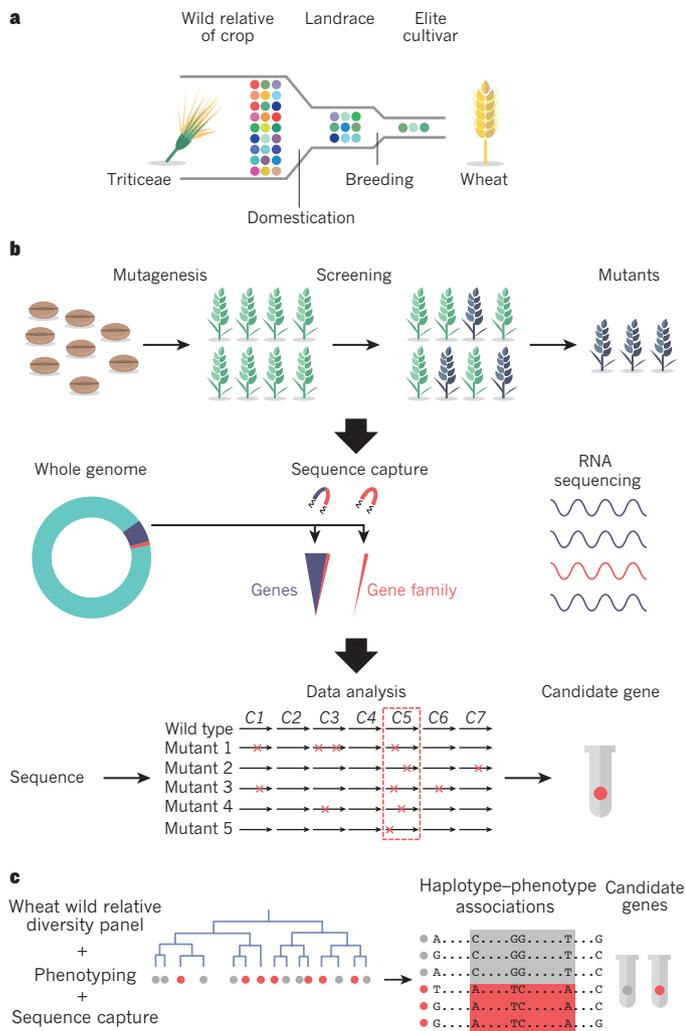


Figure 3 | Erosion of genetic diversity in cultivated crops and its re-incorporation through genomics. **a**, Genetic diversity (coloured circles) in populations of wild precursors of crops has been eroded by domestication, in which a limited range of diversity is present in landraces that were initially selected and adopted for cultivation. Subsequent breeding has drawn on a limited range of the variation present in landraces to produce the elite cultivars that are used in modern agriculture. **b**, The identification of genes for crop improvement can use mutagenesis to introduce changes into the DNA of crops (top). Mutants with desired characteristics can be identified by screening for desired properties, known as phenotypes. In practice, this method is time-consuming and imprecise unless a specific phenotype can be measured in large populations. Mutant lines with desired phenotypes are pooled and sequenced (middle). Genomics can accelerate the process of identifying mutants by sequencing populations of mutant crops (or a range of wild relatives). Sequencing can be targeted to all genes, or specific families of genes, using sequence capture methods. RNA can also be sequenced to identify changes in gene expression that are caused by mutagenesis. Sequences of mutant lines are then compared to identify genes that are consistently mutated in the lines that exhibit the desired phenotype (bottom). **c**, Genomics can also be used to access genetic variation in populations of crop wild relatives. A population can be sequenced using a variety of approaches (described in Fig. 2). At the same time, the population is screened for a range of phenotypes of interest. Patterns of sequence variation, or haplotypes, can be associated with phenotypes to identify sequence variation that may cause the phenotype.

rare genetic variants have been selected and established in populations by domestication. Archaeological evidence has shown the existence of non-shattering rice forms in the lower part of the Yangtze river basin in China between 7,000–8,000 years ago, which highlights the duration of rice domestication⁵¹. Genome analyses of wild and domesticated populations of rice identified a dramatic loss in genetic variation that occurred on

the domestication of japonica rice (*Oryza sativa* var. japonica) from wild populations⁵². About 55 domestication-related loci are known, including the genes *sh4* (seed shattering), *PROG1* (tiller angle, to maintain an upright posture during growth), *Waxy* (grain starch quality) and *qSW5* (grain width). Maize was domesticated from a wild teosinte grass that grew in Mexico approximately 9,000 years ago. Among several domestication genes, selection for the increased expression of *tb1*, which encodes a TCP-class transcription factor, reduces branching, and selection for a single amino-acid change in *tga1*, which encodes another transcription factor, reduces the hard casing around kernels to improve processing⁵³. The domestication of maize for growth in temperate climates has selected for variations in flowering time, enabling growth to adapt to higher latitudes. Several genetic loci have been selected, each with a relatively small effect on the flowering time, which demonstrates another important pattern of genomic change during domestication⁵⁴. Analysis of genetic variation in modern maize, early domesticated maize⁵⁵ and wild populations of teosinte identified almost 1,200 genes that have been affected by domestication, as well as a reduction in genetic diversity such that modern maize lines have only about 57% of the diversity of progenitor populations⁵⁶. Bread wheat arose from a chance hybridization between a cultivated tetraploid emmer wheat (*Triticum turgidum*) and a wild diploid goatgrass (*Aegilops tauschii*) (Fig. 1) in the south Caspian basin, where extant populations of progenitor species co-exist. This formed a stable hexaploid spelt (hulled) wheat, from which a free-threshing derivative was derived by selection. New characteristics such as elastic dough for bread-making were introduced from the *A. tauschii* genome, with gene dosage effects and pseudogenization contributing to some polyploid-specific traits^{57,58}. Genetic diversity in bread wheat has been constrained during the domestication of emmer wheat and by the small number of individual plants that contributed to the formation of the new hexaploid bread-wheat species⁵⁹.

Accessing genetic diversity

The cumulative effect of thousands of years of the domestication, industrialized breeding and global trade of crops is that almost all people now depend on a few dozen species for the bulk of our nutrition and that of our domesticated animals⁶⁰. Three approaches have emerged that address this troubling reliance on a few crops with limited genetic variation. The first is to diversify food sources through the domestication and improvement of alternative species: for example, quinoa and teff (*Eragrostis tef*), which are two grains with a high nutritional value and relatively low agronomic demands⁶¹. The second involves increasing the genetic diversity of elite crops: for example, by the inclusion of new traits such as disease resistance. This draws on the extensive genetic diversity of wild relatives of crops, which have evolved over long timescales and adapted to a wide range of environments. Such diversity is essential for improving many traits, including crop performance in challenging environments that are the result of water stress, high temperatures or the presence of pathogenic agents⁶². However, this irreplaceable endowment of wild species is being lost through urbanization and myriad other forms of environmental degradation. Consequently, the third solution is to halt the loss of populations of wild relatives of crops to conserve a wide range of remaining variation.

Depending on the ease of genetic exchange, undomesticated relatives of several crops have been used to increase genetic diversity. In wheat, new polyploids made by crossing different goatgrass variants with tetraploid wheats have captured a wide range of useful genetic variation. These ‘synthetic’ wheats are crossed into elite wheat lines and then backcrossed to fix desired phenotypes⁶³. A durum wheat (pasta wheat; *Triticum durum*) line that maintains high yields when grown in saline soil was created by introgressing a region of the einkorn wheat (*T. monococcum*) genome (a diploid progenitor of tetraploid durum wheat and hexaploid bread wheat) that contains a sodium exclusion pump⁶⁴. In diploid species of crop, problems with compatibility and stability can limit the range of varieties that can be used, and extensive backcrossing is required to remove undesired allelic variation.

requires the manual inspection and specific analyses of phenotypes in many plants across a number of generations. In general, large populations are needed to bring combinations of loci that encode desired traits to homozygosity and several generations (often more than six) are required. It can therefore take more than 10 years to bring a new variety of crop to market, and there is considerable uncertainty about predicting the effects of combining phenotypes, especially those of low heritability. DNA technology such as sequence markers is now widely applied to improve the efficiency of breeding. Large numbers of informative markers for DNA sequence polymorphisms are available for use in breeding programmes; these include single-nucleotide polymorphisms that can be assayed in high-throughput modes such as the fixed-content, high-density Axiom and iSelect genotyping arrays (described for wheat in ref. 74). Marker-assisted selection is used extensively in breeding programmes to monitor genomic loci that are linked to markers in breeding pedigrees and to assemble combinations of loci⁷⁵. An approach called genomic selection is also being used to accelerate breeding programmes^{76,77}. In this method, a test population that represents the genetic diversity of a larger breeding population is thoroughly genotyped and phenotyped and a breeding value that predicts phenotypic performance on the basis of marker frequencies is assigned. The larger breeding population is then genotyped and the breeding value is used to predict the phenotypes of lines in the population. By reducing the cost of and time spent on phenotyping, and by incorporating rapid generation times (known as ‘speed’ breeding⁷⁸), the amount of time that it takes to increase genetic gain is being reduced⁷⁹.

Crop breeding as a DNA-assembly problem

Genomic technologies now facilitate the rapid and cost-effective assembly of very large polyploid crop genomes, the analysis of large populations of crop wild relatives and the generation of excellent functional genomics resources for some crops, all of which enable efficient gene characterization. These capabilities can be used to identify genetic variation underlying phenotypes of relevance for improvement in crops, as well as to access a wider range of genetic variation in wild relatives of crops.

Breeding programmes use recombination to integrate desired combinations of traits to form improved varieties. Conventionally, the heritability patterns of phenotypes are the main method by which genetic combinations are assessed. The identification of quantitative trait loci in both elite lines and their wild relatives helps to define genomic loci that usually contain several candidate genes and many sources of genetic variation that either do not contribute to the desired phenotype or have deleterious effects. These ‘compound-effect’ loci can then be incorporated into breeding programmes through marker-assisted selection. Combinations of genomic regions that confer desired traits can be considered as sets of haplotypes that are defined by underlying genetic variation. Therefore, genomic information aids breeding by defining desired combinations of haplotypes for selection in breeding programmes.

Two approaches, one retrospective and the other prospective, hold promise for the integration of genomics and breeding using haplotype selection. The retrospective approach aims to identify the haplotypes that have been used by plant breeders. It involves the sequencing and assembly of key breeding lines that have been used widely over an extended period and the re-sequencing of lines in pedigrees that were selected. As these pedigrees have been phenotyped extensively in multiple environments, the genomic regions (and the genetic variation and haplotypes at these regions) that are associated with the decisions of breeders will be revealed. These haplotypes, including the genetic variation that they carry and their phased markers, can then be used in three ways. First, the biological functions of the region of DNA that contains the haplotype (haplotig³²) can be established from systematic genomic analyses, including studies of gene function and gene networks, expression patterns, chromatin structure⁸⁰, epigenetic modifications and the influence of genetic variation on gene function. Genetic variation that causes desired phenotypes, as well as any deleterious variation, can be

identified. Second, the markers that define the haplotig can be combined with those for other functional haplotigs to form a genome-wide set of markers that can be used *a priori* in breeding programmes to select new combinations of haplotigs, each with well-defined phenotypic effects. Finally, the haplotig-defining markers can also be used to identify lines in which linkage in the haplotig has been broken to separate desirable and undesirable genetic variation (Fig. 4). This ‘haplo-genomic’ approach uses specific functional and genetic relationships that are defined by genome-wide haplotypes. It also differs from genomic selection, which uses genome-wide markers as anonymous features that are statistically related to phenotypes in only a subset of the breeding population⁸¹. Spindel *et al.*⁸² describe how genome-selection approaches can be integrated successfully with association studies to accelerate genetic gain in rice-breeding programmes, which indicates that the integration of genome-wide haplotype information may provide breeding programmes with an even greater specificity and predictability.

A prospective approach to haplotype-led breeding involves the sequencing of populations of the progenitors and wild relatives of crops to identify conserved ancestral haplotigs that contain a broader range of genetic variation. This approach is demonstrated by the identification of new loci that are associated with tolerance of salinity using low-coverage sequencing of 106 diverse soya bean (*Glycine max*) lines⁸³ and by exome sequencing from several wheat lines⁸⁴. Genetically structured populations, genetic-association analyses and targeted sequencing can be used to define new haplotypes with greater variation, fewer deleterious alleles and improved phenotypes for incorporation into breeding programmes⁶⁷. Markers that define the haplotype can then be used to track its incorporation into breeding pedigrees.

The process of haplotype assembly (Fig. 4) during breeding can be followed using sets of genetic markers that define the haplotypes under selection. To assemble multiple haplotypes, large numbers of F₂ progeny (more than 10,000) will need to be screened⁷⁶, with several markers that span each haplotype for phasing and for selecting desired variants of each haplotype. Because current marker technologies are too expensive for use in this approach, innovative methods will need to be developed. Multiple genome assemblies of the parental lines and other genomic resources will reveal the underlying order of markers and sequence variation in each haplotype. The throughput of current technologies such as the Illumina HiSeq 4000 and HiSeq X Ten platforms is such that a single lane can generate 110 Gb of 150-bp sequence reads in 3 days. This equates to the sequencing of 10,000 loci in 10,000 individuals to a depth of about 1000× at a cost of less than US\$1 per sample. Multiplexed primer-based assay technologies have the potential to deconvolve the sequencing read data to count and map haplotype assemblies in several lines⁸⁵. Complementary approaches such as linked-read⁴² sequencing and long-read sequencing³⁵ also show promise for the large-scale genetic analyses of populations in genomics-led breeding strategies.

Progress towards the application of genomics to breeding is also revealing the potential limitations of current genomic technology. In the large genomes of maize, wheat and many other important crops, recombination is highly suppressed across extensive pericentromeric regions owing to the methylation of repeat regions⁸⁶. These regions contain a large number of functional genes, which are therefore not accessible to breeding programmes. It may be feasible to target double-strand breaks to specific regions of chromosomes using CRISPR–Cas9 technology to stimulate recombination. Although mitotic recombination can be targeted precisely in yeast cells, and the fine-mapping of loci is also possible⁸⁷, it is difficult to imagine using this approach in multicellular organisms such as plants. It may be possible to use a promoter that is specific to prophase 1 of meiosis or an inducible promoter to express the gene that encodes Cas9 and guide RNAs to create new, targeted patterns of double-strand breaks in the germ line and to promote recombination in new regions of interest during normal meiosis.

Automated phenotyping

Innovative specialized technologies for phenotyping are improving

the resolution, precision and scale of measurements of crop growth and development^{88,89}. These approaches can also measure important physiological characteristics, including water use and photosynthetic efficiency, in the field⁹⁰. It will be necessary to complement genomics-led breeding with an increase in the scale and precision of phenotyping using drones and networks of sensors, as this will facilitate the genetic analysis of much larger populations in breeding programmes and generate multidimensional data sets of genotype–environment interactions. To meet this goal, networks of mobile and static sensors for measuring crop performance and the environment need to be established at the farm scale. Once developed, this capability can be used for standardizing, capturing and maintaining crop phenotype data⁹¹ and for integrating the data with environmental and genetic variation data. Such an approach will help to meet the important international goal of creating more resilient crops that maintain high yields with lower agronomic inputs, and that are better able to adapt to pests, diseases and fluctuations in climate such as variations in temperature or the water availability of the soil.

Outlook

Progress in genomics technologies is now enabling the rapid and cost-effective sequencing and assembly of the largest and most complex plant genomes. Researchers can now access and characterize a vast reservoir of natural genetic variation from wild or undomesticated relatives of crops. The application of improved short-read sequencing and genome assembly will continue to provide the most cost-effective solutions for the accurate *de novo* assembly of larger plant genomes and accessing genetic diversity. However, it is clear that sequencing technologies that involve longer reads, including single-molecule, real-time sequencing, and linked-read sequencing on long molecules will have a major impact by improving sequence assembly and perhaps even by supplanting the short-read sequencing of crop genomes if increases in accuracy and cost-effectiveness can be maintained. Population genomics is now feasible for large populations of plants with complex genomes through exome sequencing. It is also plausible that real-time selective sequencing using the long-read nanopore device MinION⁹² will be developed to the extent that it can be applied to the identification of both genetic and epigenetic variation^{93,94} in any gene family in populations of plants. Linked-read technologies are ready to be applied to large-scale haplotype analyses such as the identification of precise regions of introgressed chromosomes and assemblies of desired haplotypes in breeding pedigrees.

Despite these important advances in genomics, the continued development of sequencing technology and computational methods is needed to improve the cost-effectiveness, quality and coverage of genome assemblies of multiple plant genomes. Studies that include the re-sequencing of populations of wild and domesticated lines will also be needed to better characterize population-level genetic variation and its association with relevant phenotypic traits.

To meet goals for food security, a future challenge will be to develop innovative genomic and bioinformatic applications and apply these to the high-throughput identification of genes for traits and for breeding systems. Interactions between the genomes of hybrids and polyploids that give rise to new and improved traits can now be understood at the genome level, and this information has been used to select parent plants with improved potential for yield increases in hybrid breeding systems. The breeding process, which has already been accelerated substantially by the application of genomics, is now poised to undergo a step change in the specificity and precision of selecting parents, identifying haplotypes, screening progeny for desired combinations of haplotypes and predicting performance on the basis of genetic information. This progress is timely because it has a central role in securing food supplies in the future. ■

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