Plant Pan-genomes: A New Frontier in Understanding Genomic Diversity in Plants

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This work was carried out in collaboration among all authors. All authors read and approved the final manuscript.

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ABSTRACT
The comparison of several associated species and plant genome sequencing efforts has increased in recent years. The inflated level of the genomic variety leads to the discovery that the single reference genomes may not reflect the variability in a species, resulting in the evolution of a pan-genome idea. Pan-genomes exhibit a species' genetic variability and contain mutant genes lacking in some individuals and essential genes present in all individuals. Mutant gene classifications often reveal cross-species parallels, including genes for abiotic and biotic stresses generally concentrated within mutant gene groupings. Here we discuss the history of pan-genomics in plants, investigate the causes of gene variation, deletion, and existence and demonstrate why pan-genomes might assist crop genetics and breeding research.

Keywords: Pan-genome; presence and absence variations; whole-genome assembly; mutant gene; polyploid; transposable elements; homoeologous exchange.
1. INTRODUCTION

The notion of pan-genomes was initially introduced in bacteria in 2005 [1] when the sequencing of numerous strains of *Streptococcus agalactiae* identified an important genome characterized by 80% of *S. agalactiae* genes, while the remaining 20% missing in at least one isolate [1]. However, it took a decade following the initial bacterial pan-genome effort to develop plant pan-genomes. Although this was mainly owing to the significant costs associated with collecting and analyzing data, it was also anticipated that there would be very little gene presence and absence variations (PAVs) in higher species since they transfer genetic material not as easily as microbes [2]. When it was first utilized in plants in 2007, it was used to find small mutant sections of the rice and maize genomes that differed from each other [3]. However, because of the absence of precise whole-genome assemblies for numerous individuals of the same species at the time, it was impossible to determine the extent to which genes were present or absent. When the cost of DNA sequencing decreased, it became practical to compare complete genomes of different individuals, and three broad methodologies for supra-genome assembly were devised [3] (Fig. 1). The initial approach was whole-genome assembly (WGA) and comparison, which involves assembling and comparing the genomes of various individuals [4,5]. This was then supplemented by the repeated assembly and, PAV strategy, in which genomic sequences from several species are matched to a database, and unaligned data is assembled and contributed to the increasing pan-genome reference. Following that, entire readings are remapped to the pan-genome, which allows for accurate PAV calling throughout the population. In recent years, a lot of progress has been observed in graph-regulated pan-genome assembly, which constructs a network expressing genetic conservation and variability [6].

In addition to being highly complementary, the WGA and comparison strategy provides critical structural and gene whereabouts. In contrast, the recurring assembly technique allows the extension of research to exceptionally multiple participants, identifying infrequent genes and the dispersion of PAV in a population. It has only recently become possible to use graph assembly in more complicated genomes. If we study microbes, graph assembly has been used a lot since long-read DNA sequencing has become more credible.

Each of these methods has advantages and disadvantages; for example, a repetitive assembly cannot distinguish between high sequence variation at a locus and sequence addition or deletion, whereas WGA cannot distinguish among true genome diversity across individuals and frequent mistakes and variation reported in assembling and annotating methods. The graph-based analyses of plant genomes are just valuable for a small number of plant genomes right now because they require a lot of memory and data space, and they also have other limitations.

Recently, a lot of focus on plant supra-genome investigations is observed (Table 1). In order to create the first plant pan-genome, seven wild soybean individuals were contrasted for the first time [7]. The results revealed a significant variation in seed yield and size, seed structure, days to flower and maturation time, and further copies of disease tolerance genes in the wild *G. soja*. When 18 *Arabidopsis thaliana* accessions were evaluated [8] in a prior study, the researchers focused on protein isoforms and gene expression instead of gene availability and unavailability. In parallel with the soybean genome assemblies, a loss in the S5 hybrid infertility region in a single genotype and PAVs in the subsurface resistance gene Sub1A were detected in a short rice supra-genome derived from four different genotypes [9].

In a recent study of seven de novo constructed *Brassica napus* genomes, two PAVs, each representing hAT retrotransposon incisions inside known flowering time genes, were discovered to be linked with flowering time [10]. Another research in *A. thaliana* found non-syntenic hotspots of rearrangements (HOTs) linked to sequential duplications based on seven assemblages [11]. There is less meiotic recombination in these HOTs, and they have fewer genes, with disease resistance genes being substantially more prevalent. Mining for HOTs in other plant species is presently not viable owing to a lack of high genomic assembly for several individuals of a species. There has not been any evidence of a link between disease tolerance and hotspots for rearrangement.
Fig. 1. Comparison of Pan-genome approaches

A number of pan-genome studies, including *Brassica oleracea* (based on 10 individuals [12]), bread wheat (based on 18 individuals [13]), and canola (based on 53 individuals [14]) have used the iterative mapping and assembly approach [4] to reduce the expense of producing high-quality assemblies for numerous individuals. Two important findings were made in these initial plant pan-genome studies: each species studied had between 15% and 40% of its total number of gene content, and genes that make PAV are often linked to biological and environmental stress resistance.

Other recent research has included the analysis of a pan-genome using 54 *Brachypodium distachyon* plants, which discovered additional 7,134 genes and found that certain mutant genes are core genes inside sub-populations [15], hence sustaining the population structure. Five sesame plants were utilized to generate a sesame pan-genome [16], allowing for genetic differentiation among traditional and contemporary sesame varieties. This suggests that pan-genomes may be used to identify alterations in the gene frequencies throughout cultivation and breeding. There were three genes associated with seed weight in the latest pan-genome research of 90 individuals of *Cajanus cajan*, demonstrating that presence and absence variations (PAVs) may be used to enhance SNPs for trait correlation [17].

There is a rising interest in the dispersion of mutant genes in populations as a result of the growing popularity of pan-genome studies. More than 10,000 new genes were identified in a rice supra-genome study of 66 representative samples from 387 wild *Oryza rufipogon* and 1100 *O. sativa* genotypes [9]. Additionally, they confirmed prior findings from three rice accessions [18] linking submergence tolerance and phosphate deficiency tolerance genes. Using 725 distinct tomato lines, a pan-genome analysis was conducted [19] that discovered 4,873 genes, mostly were associated with disease tolerance. The study also discovered an atypical allele associated with *Solanum lycopersicum* flavor that was chosen during domestication but re-emerged in current *Solanum lycopersicum*
varieties as a result of wild introgressions. There has recently been an investigation into the diversity associated with agronomic traits in soybean using a pan-genome research that united the assembly of 27 lines with re-sequencing data from 2,898 different lines [20].

2. PAN-GENOMES AND PLANT BIOLOGY

Many of the plants used for reference genome sequencing have historical significance; such as the *Triticum aestivum* cultivar Chinese Spring was chosen for reference genome sequencing because it was this cultivar that the current karyotype system was developed [21]. The genes of Chinese Spring, on the other hand, are considerably different from that of current cultivars. Using the initial *T. aestivum* pan-genome research, scientists discovered 11,840 genes, found in 22 re-sequenced current types but missing from Chinese Spring [22]. The usage of a single reference (SR) may influence our knowledge of the genetic foundations of phenotypes; such as, the Lr49 *T. aestivum* rust tolerance gene exhibits unusual structural diversity across cultivars [19]. A wide range of genomic studies will get better if they use pan-genomes as references. For instance, utilizing a pan-genome assembly increases short-read mapping efficiency over an SR, leading to better mutant calls and more exact measurements of gene expression [23-25]. It is still difficult to distinguish plant species solely on gene encoding, especially when there is a lot of variation in gene PAV across individuals. However, when more species' pan-genomes are created, a better knowledge of gene retention and deletion might well aid in establishing species-level modifications in gene expression.

**Table 1. Description of various plant pan genome studies**

<table>
<thead>
<tr>
<th>Species</th>
<th>Approach</th>
<th>Domestication status</th>
<th>Ploidy</th>
<th>Number of accessions</th>
<th>Pangenome genes</th>
</tr>
</thead>
<tbody>
<tr>
<td>Soybean</td>
<td>De novo</td>
<td>Crop</td>
<td>Diploid</td>
<td>204</td>
<td>3,621</td>
</tr>
<tr>
<td>Maize</td>
<td>Iterative</td>
<td>Crop</td>
<td>Diploid</td>
<td>503</td>
<td>8,681</td>
</tr>
<tr>
<td>Maize</td>
<td>De novo</td>
<td>Crop</td>
<td>Diploid</td>
<td>2</td>
<td>-</td>
</tr>
<tr>
<td>Wheat</td>
<td>Iterative</td>
<td>Crop</td>
<td>Hexaploid</td>
<td>18</td>
<td>140,500</td>
</tr>
<tr>
<td>Soybean</td>
<td>De novo</td>
<td>Wild and crop</td>
<td>Diploid</td>
<td>26</td>
<td>57,492</td>
</tr>
<tr>
<td>Brassica rapa</td>
<td>De novo</td>
<td>Crop</td>
<td>Diploid</td>
<td>3</td>
<td>41,858</td>
</tr>
<tr>
<td>Glycine soja</td>
<td>De novo</td>
<td>Wild</td>
<td>Tetraploid</td>
<td>7</td>
<td>59,080</td>
</tr>
<tr>
<td>Populus</td>
<td>Read mapping</td>
<td>Wild</td>
<td>Diploid</td>
<td>7</td>
<td>-</td>
</tr>
<tr>
<td>Brassica napus</td>
<td>Iterative assembly</td>
<td>Crop</td>
<td>Tetraploid</td>
<td>53</td>
<td>94,013</td>
</tr>
<tr>
<td>Pepper</td>
<td>Iterative assembly</td>
<td>Crop</td>
<td>Diploid</td>
<td>383</td>
<td>51,757</td>
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<tr>
<td>Tomato</td>
<td>Iterative assembly</td>
<td>Crop</td>
<td>Diploid</td>
<td>725</td>
<td>40,369</td>
</tr>
<tr>
<td>Juglans (walnut)</td>
<td>De novo</td>
<td>Wild</td>
<td>Diploid</td>
<td>6</td>
<td>26,458</td>
</tr>
</tbody>
</table>

Gene PAV can be used to boost agricultural yields and plays an important role in the study of fundamental biology. More than 30% of the advances in crops production in the late 20th century were attributable to crop wild relatives utilization in the crop breeding programs [26]. Crop wild relatives frequently have a greater collection of genes and represent a rich foundation of genetic diversity for crop breeding. With the use of pan genomic research, we can examine gene retention and deletion during breeding and adaptation [27], which assists in discovering dispersed variability and the capability of incorporating genes into current cultivars. Such as, gene deletion related to flavor, which occurred during the introduction of tomatoes in Chile, Mexico, and Brazil, has recently been incorporated into new varieties [28]. Gene distribution research among wild species in various settings might aid in the development of agricultural plants that are more adaptable to a variety of environments and more resilient to climate change [29].
Disease resistance genes have a negative impact on fitness [30]. However, recent discoveries of multiple genes across plant supra-genomes have revealed that they are accumulated for genes engaged in adaptations to abiotic and biotic stress, specifically for genes associated with disease resistance. Wheat [31], rapeseed [32], wild cabbage [33], and tomatoes [34] are all examples of monocots and dicots that have been shown to contain a wide range of disease-resistant genes and human-based pan-genomes have also reported similar results [35,36]. The discovery of the NLR disease resistance genes has given birth to the idea of a pan-genome research study called the pan-NLRome [37]. It has only been used in A. thaliana [38] until now, and only 37 out of 64 accessions were adequate to get 90% of the NLR genes. A large number of disease resistance genes are clustered together in physical clusters [39–42], with some of them exhibiting significant variation [43,44]. Clustered genes may be different from unclustered genes because of the irregular crossing over and meiotic disruption due to orthologous repeats in these clusters [45]. This happens only for specific kinds of disease tolerance genes (type I), whereas type II genes prove only a few genomic changes in wild cabbage [46], which is similar to findings in Arabidopsis thaliana [47].

While disease resistance genes are abundant in the mutant gene fraction in many plant species, this is not true in all. The Amborella pan-genome, for example, has a small number of disease resistance genes, most of which are core genes, which might represent the species’ unique geographic location and evolutionary record. Abiotic stress and environmental adaptability are frequently connected with mutant genes [19,32], implying that these genes may be useful in crop breeding techniques in the future.

**Fig. 2. Different sources for novel genes**
3. INCEPTION OF MUTANT GENES IN PLANTS

Even though the predominance of the gene PAV has been well documented, the genesis of mutant genes is still a subject of much debate. Several processes of gene losses and gains have been identified in plants, all of which have the potential to contribute to mutant gene creation (Fig. 2). Introduction from similar species, horizontal gene transmission, and de novo gene formation are all ways to get new genes [48-52]. As a consequence of deletions, such as those resulting from intra-chromosomal recombination and pseudogenization, genes may potentially be lost [12,53,54]. The study of pan-genomes in plants gives a complete picture of how different mechanisms of addition and deletion affect the total number of genes in organisms, as well as how adaption can change the frequency of different genes.

There appear to be a higher fraction of mutant genes in polyploid species compared to diploid species; however, there are presently not many polyploid pan-genomes accessible to corroborate this tendency. Dominant sub-genomes can affect allopolyploid gene content, as seen in *Fragaria × ananassa* [55,56] and *B. napus* [57,58], with the dominant sub-genomes containing a higher number of significant genes. In the case of WGDs (whole-genome duplications), the entire genome complement is doubled and is often followed by gene loss, renowned as fractionation. After differential fractionation, the *B. lineagea* had a whole-genome triplication, which produced three sub-genomes: LF; the lowest fractionated, MF1; the most fractionated first, and MF2; the most fractionated second [59,60]. The pan-genome of *B. oleracea* showed that there was a statistically significant relationship between the sub-genome assembly and the number of mutant genes, with MF2 having the most and LF having the fewest [61]. On extremely short evolutionary time scales, the sub-genomic position of mutant genes in canola is expected to correlate with the rate of gene loss, which connects with an intraspecies variation.

Moreover, most of the mutant genes in *B. oleracea* were not allocated to sub-genomes [62,63], echoing a finding in *Brachypodium* that mutant genes are less syntenic with orthologous sections in other grasses, showing that they are developed outside of syntenic blocks [64]. *Sesamum indicum*, which experienced whole-genome duplication roughly 80 million years ago, was the subject of pan-genome research that sought to determine the origin of core and mutant genes. Whole-genome duplication was shown to be responsible for more than one-third of the core genes and just around 12% of the mutant genes. Many of the mutant genes assigned to the whole-genome duplication origin, do not occur in syntenic blocks, which explains the low fraction of mutant genes attributed to the whole-genome duplication origin. Local tandem duplications could be attributed to a comparable percentage of the core and mutant genes (both 10 percent), indicating that, for *S. indicum*, tandem duplications (TD) are not a substantial cause of mutant genes, despite the presence of line-specific variations [65].

Another typical source of gene PAV in amphipolyploid plants is the homoeologous exchange (HE), which occurs in amphidiploid plants [23,66]. As previously mentioned, rapeseed is one species in which significant homoeologous exchanges have been discovered and associated with phenotypic variation [5,29,67,68]. In rapeseed, substantial homoeologous exchanges have been found and connected to phenotypic diversity. In rapeseed, where A genome replacement is more common than C genome replacement, it is proposed that directionally influenced HEs might result in sub-genome dominance [69-72], as shown in wheat [73], polyplod strawberry [74], non-crop monkeyflower [75-78], cotton [79,80] and coffee [67]. A pan-genome study of the rapeseed genome indicated two categories of gene PAV incidents: non-homoeologous exchange PAV (in which single genes differ) and homoeologous exchange PAV (in which lengthy extends of successive genes are missing caused by large genomic region exchanges) [33].

In plants, transposable elements (TEs) have been linked to genic variation development, according to pan-genome studies. The relationships between transposable elements, gene mobility, and gene PAV have been well established for many years [65,81-83]. In recent years, however, pan-genome research has provided a more refined view on the role of transposable elements on gene variability, indicating that intraspecies TEs dynamics may considerably contribute to the variation in gene addition and deletion [34,65]. It has been documented in *B. oleracea* [33] and *Brachypodium* [36,60] that TEs and varied genes are associated, and it has also been reported in rapeseed disease resistance genes [33] that TEs
are associated with mutant genes [32,58]. As previously stated, a rapeseed pan-genome based on complete genomic sequences of seven populations indicated a role for different TEs in the regulation of agronomic parameters [30], which is consistent with prior results. From Barbara McClintock’s discovery of genetic variants that may be changed in maize [84], TE activity has been shown to be correlated with genome rearrangement. Multiple instances of TEs that led to the gene PAV are reported, most notably in A. thaliana [83] and Z. mays [65]. To further understand the TE–PAV relationship, additional pan-genome investigations, such as examining whether particular transposable element families are probably more linked to PAVs than others and if such links are species-specific or universal, would be helpful to researchers. It is constantly being worked on to improve the techniques for predicting and categorizing TEs within genome assemblies [85–87], which will eventually result in improved knowledge of the function of transposable elements in gene diversity in the near future.

De novo gene origin [87] is a source of mutant genes that have been relatively understudied in comparison to other sources. When the genomes of thirteen Oryza related species were examined, researchers discovered 185 de novo ORFs in the primary species, Oryza japonica, indicating that de novo gene origin is important for the creation of proteome variability in this species. Long non-coding RNAs have also been considered as a possible source of new proteins for protein synthesis [88,89] since they seem to be genetically efficient from protein-coding genes and also have higher tissue selectivity [90]. Researchers observed that non-coding transcripts were responsible for the majority of the de novo genes identified in Oryza [63]. In turn, comprehensive annotation and research of long non-coding RNAs (lncRNAs) may, as a result, broaden the repository of plant-specific genes and increase the likelihood of the identification of new proteins throughout the evolution process.

4. CONCLUSION AND FUTURE DIRECTIONS

The growing abundance of genome sequence data has aided pan-genome investigations, and this trend will continue as long-read sequence data quality and affordability increase rapidly. Over time, as we get a better grasp on the influence of mutant genes, it is possible that single reference assemblies may be rendered obsolete in favor of pan-genome reference assemblies. This would provide a wealth of information on genome evolution, selection, and functional properties.

Many researchers are struggling with the storage and display of pan-genome datasets. Because of the abundance of long-read sequence data, it is possible to use vg [91] or MGR [92] to store variations for whole populations. This allows the use of pan-genome mutation graphs, which record mutations for whole populations. Standards for genome structure and classification are needed to facilitate structural variance in genomes. When it comes to plant breeding populations, the use of feasible haplotype graphs for the expandable generation of pan-genomes represents a significant advancement [93,94]. In order to abstain from difficulties in arranging extremely variable and recurring sections, these graphs depend on a reference genome correlated pathway that uses genes as anchors.

A major problem is that gene and genome functional annotation methods are substantially behind methodologies for genomic assembly, and the purpose of numerous variable genes remains unsolved. However, we know that mutant genes have some characteristics in common, including that they are least likely to be syntenic, evolve under less evolutionary limitations, and have low expression levels [95,96]. According to researchers, developing a better knowledge of the roles and connections among the core and mutant genes would considerably contribute to the utility of pan-genome investigations. The use of integrative genomics approaches, which attempt to relate features of genes such as sequence integrity to their function, relationships in biological networks, and expression level [97], could be a possible approach.

Most pan-genome research conducted up till now has concentrated on the gene-containing portions of genomes; nevertheless, genomic areas outside of genes have been shown to account for a significant fraction of phenotypic variability in plants [98]. This shows that many essential breeding parameters, such as gene PAV, may be influenced by variations in gene regulation instead of gene expression. For instance, a promoter related to fruit flavor [38,97,98] was discovered under selection in the Solanum lycopersicum pan-genome. With the use of epigenomic functional annotations, pan-
genomes give a wealth of information on regulators that may be mined for breeding purposes.

Pan-genomes of prokaryotic organisms have recently been discovered and even crossing phylum borders, with one research including 8,203 genomes from 10 different prokaryotic phyla [95]. These investigations are computationally viable since the genomes of haploid prokaryotes are very tiny. Although no pan-genome has yet been discovered in plants, this is most likely due to computational and funding restrictions on researchers. The ability to link pan-genomes at the genus or even family level will likely become more accessible as sequencing expenditures continue to decline and computational power increases. This will allow us to think critically, like what gene content is needed to produce a legume, which will be possible as sequencing expenditures keep falling and computational power continues to rise. At last, this will enable us to anticipate and define the gene composition of every plant species, information that will have a profound impact on future genome research in general. Such comprehensive pan-genomes will enable us to address a question of centuries: which genes are responsible for the formation of a plant?

COMPETING INTERESTS

Authors have declared that no competing interests exist.

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