The ubiquitous position effect, synergistic effect of recent generated tandem duplicated genes in grapevine, and their co-response and overactivity to biotic stress

Junjie Qu, Lulu Liu, Zexi Guo, Xudong Li, Fengying Pan, Dayun Sun and Ling Yin^{*}

Guangxi Crop Genetic Improvement and Biotechnology Key Lab, Guangxi Academy of Agricultural Sciences, Nanning 530007, China * Corresponding author, E-mail: yinling@gxaas.net; ling.yin.2022@qq.com

Abstract

Tandem gene duplication is an important process in plant adaptive evolution, but the generation mechanism and expression characteristics of tandem duplicated (TD) genes and their roles in plant stress response have not been rigorously investigated. Here, we take grapevine (*V. vinifera*) as an example to show that recent large-scale tandem gene duplication, mediated by long terminal repeat retrotransposons, promotes the expansion of specific gene families involved in response to biotic stress, biosynthesis of various secondary metabolites and adaptive evolution. More importantly, compared with interspersed duplicated genes, TD genes exhibit a position and synergistic effect, and multifaceted overactivity and play key roles in response to biotic stress caused by pathogens such as *P. viticola* (downy mildew) and *Erysiphe necator* (powdery mildew). The higher co-expression level of TD genes is not only reflected in the co-response to biotic stress, but also universal in various tissues and developmental stages. This may be related to a higher level of co-regulation and a higher transcription factor regulatory efficiency, as well as sequence similarity within gene clusters. Moreover, most TD genes are expressed asymmetrically, while maintaining a relative balance, which may be beneficial for the retention and functional differentiation of the TD genes. These findings not only advance our understanding of the evolution of the *V. vinifera* genome and the evolution dynamics of the TD genes which has often been overlooked, but also provide guidance for the directional selection in breeding work.

Citation: Qu J, Liu L, Guo Z, Li X, Pan F, et al. 2023. The ubiquitous position effect, synergistic effect of recent generated tandem duplicated genes in grapevine, and their co-response and overactivity to biotic stress. *Fruit Research* 3:16 https://doi.org/10.48130/FruRes-2023-0016

Introduction

Gene duplication is the main mechanism by which new genes and, ultimately, new biological functions are generated, which is very important for plant evolution and adaptation^[1,2]. In addition to whole genome duplication (WGD), the two other major gene duplication mechanisms are segmental duplication and retrotransposition^[3,4].

Unequal crossing-over between homologous chromosomes is a very important way to generate segmental duplication^[5], resulting in gene clusters and multiple tandem duplicated (TD) genes belonging to the same gene family^[6,7]. Based on the publication, in recent years, of a large number of plant genomes, it has become clear that many important functional genes exist in plant genomes in the form of homologous gene clusters^[8–10]. Increasing evidence has suggested that gene expansion caused by tandem duplication (TD) may contribute to environmental adaptation^[11-13]. But at present, most of these discoveries on plant TD genes are aimed at specific traits, genes or metabolic pathways. There are few systematic studies on TD genes from the genome-wide level. Furthermore, how TD genes arise and evolve, and how they specifically participate in a corresponding pathway, in genome evolution and in species adaptation, is still unclear.

Transposable elements (TEs) are an important component of the plant genome^[14–16], which can affect gene expression by providing novel promoters or regulatory regions^[17]. The epige-

netic profile of the TEs can also alter gene expression^[18]. Long terminal repeat retrotransposons (LTR-RTs) are the most prevalent TEs in plant genomes and the major force driving the evolution of animals, fungi and especially plants^[19]. The proliferation of LTR-RTs could result in genome bloating^[20], leading to the replication of new interspersed retrogenes by means of retroduplication^[21–23]. At the same time, as a type of repeat sequence, its insertion can also increase the frequency of unequal exchange in surrounding genomic regions^[24,25]. However, there is still a lack of direct evidence in plant genomes that LTR amplification is associated with unequal crossing-over, as well as TD gene amplification.

Plants experience various biotic stresses throughout their life cycle and many different types of genes respond to these stresses by differential changes in expression^[26]. Numerous studies focus on this topic have discovered a variety of important functional genes which are of great significance to plant stress resistance breeding^[27–30]. However, the vast majority of important functional genes are not present as single-copy genes in the genome. In the long evolutionary history of plants, in order to better adapt to the environment, a large number of multi-copy gene families related to various stress responses have arisen through different gene replication mechanisms^[16,31,32]. Unfortunately, few studies have focused on whether these various types of paralogous genes, with similar sequences and functions, which have been generated by different duplication mechanisms are all induced in response to a specific stress, or

which kind of genes are more likely to be induced than others. Furthermore, compared with interspersed duplicated genes, TD genes are located closer to each other in the genome. Little attention has also been paid to whether this positional difference leads to different expression characteristics, especially in response to stress. This is important because whether a gene is of great significance to the environmental adaptation of a species, depends not only on whether it has an effective molecular function, but also on whether it can express efficiently at the right time to play its role. Therefore, answers to these questions are critical for precise phenotype prediction and efficient selection of target genes in future breeding efforts.

Grapevine (Vitis vinifera L.) is indisputably one of the most popular fruit crop species in the world. Previous studies have shown that V. vinifera and dicots shared the same whole genome duplication event (r-WGT)^[33,34]. However, besides WGD, there is a lack of knowledge about other large-scale gene duplication events in V. vinifera and the mechanism underpinning these duplication events. In addition, nearly 50% of the grapevine genome is composed of repetitive/transposable elements (TEs)^[33]. This provides a good model for studying the effects of TEs/LTRs on gene duplication and genome evolution. Here, taking V. vinifera as an example, our genome-wide scale studies have shown that recent large-scale tandem gene duplication mediated by LTRs promotes the expansion of specific gene families involved in response to biotic stress, biosynthesis of various secondary metabolites and adaptive evolution in V. vinifera. More importantly, TD genes with similar protein sequences and upstream regulatory sequences exhibit a position effect and a synergistic effect and multifaceted overactivity and play a pivotal role in response to biotic stress caused by downy mildew (P. viticola) and powdery mildew (E. necator), the two most important diseases of grapevines. However, the higher co-expression level of TD genes is not only reflected in the co-response to biotic stress, but also across various tissues and developmental stages. This may be due to higher levels of co-regulation such as histone modification and higher transcription factor (TF) regulatory efficiency. Moreover, a relative expression balance is maintained between TD genes, which may be beneficial to provide relatively reduced constraint for the retention and further functional evolution of TD genes.

Results

Tandem gene duplication contributes to *V. vinifera* biotic stress resistance and berry flavor

Gene duplication produces paralogous genes with similar sequences and functions, resulting in multi-copy gene families^[7]. Tandem duplicates are paralogous genes closely adjacent to each other in the same chromosome^[10]. A total of 13,677 gene families were identified by using OrthoMCL to classify all 27,978 genes located on 19 chromosomes in the *V. vinifera* cv. PN40024 genome^[33]. Next, paralogous genes from the same family and with no more than two other intervals in the genome were defined as TD genes^[35]. A total of 5,341 TD genes were identified from 19 chromosomes, and the remaining 22,637 genes were classified as 'notTD genes'. We then defined gene families containing TD genes as 'TD-families' and gene families without TD genes as 'notTD-families'. This facilitates an efficient comparative analysis between tandem

duplicated (TD) genes with interspersed duplicated genes from the same family. Our subsequent analysis found that the number of TD-families only accounted for 7.02% (960/13,677) of all gene families in the genome, but the number of TD genes in TD-families accounted for up to 19.09% (5,341/27,978) of the total number of genes in the genome. Most strikingly, TD genes accounted for up to 57.10% (5,341/9,353) of all genes in TDfamilies (Supplemental Table S1). Although they are distributed on all 19 chromosomes (Fig. 1a), most of the TD genes from the same family are present on the same chromosome as only one gene cluster (Supplemental Fig. S1). Furthermore, comparative analysis between TD-families and multi-copy notTD-families showed that the former contained significantly more genes (t test, $p = 1.86 \times 10^{-39}$; Fig. 1b). Moreover, linear regression analysis found that the total number of all genes in the TD-families was significantly positively correlated with the number of TD genes it contained in the corresponding family (Fig. 1c). Taken together, it is clear that tandem gene duplication plays a key role in the expansion of a small subset of specific gene families and largely determines the extent of expansion.

It is well known that secondary metabolites, such as terpenes and flavonoids, are responsible for the principal flavour and aroma compounds in grape fruit, wine and juice^[36-38]. Additionally, decades of studies have revealed a large number of secondary metabolites with proven functions in plant responses to biotic stresses caused by pathogenic microorganisms or pests^[39–41]. Kyoto Encyclopaedia of Genes and Genomes (KEGG) enrichment analysis showed that the 5,341 TD genes were significantly (p < 0.01) enriched in biosynthesis pathways of secondary metabolites including monoterpenoid biosynthesis (map00902); sesquiterpenoid and triterpenoid biosynthesis pathways (map00909); phenylpropanoid biosynthesis (map00940); flavonoid biosynthesis (map00941); isoflavonoid biosynthesis (map00943); flavone and flavonol biosynthesis (map00944); and stilbenoid, diarylheptanoid and gingerol biosynthesis (map00945); tropane, piperidine and pyridine alkaloid biosynthesis (map00960) (Fig. 1d & Table 1, Supplemental Table S2). All of these pathways are closely related to flavor and aroma compounds and/or plant defense to biotic stresses^[27,29,36,42-47]. In particular, tandem gene duplications are present in many reaction steps in phenylpropanoid biosynthesis (map00940) and flavonoid biosynthesis (map00 941) (Supplemental Figs S2, S3 & Table 1). Phenylpropanoid biosynthesis (map00940) provides precursors for numerous pathways related to biotic stress response or fruit flavor, such as ubiquinone and other terpenoid-quinone biosynthesis (map00130), flavonoid biosynthesis (map00941), stilbenoid, diarylheptanoid and gingerol biosynthesis (map00945)^[48]. Phenylpropanoids are major players in plant immunity and contribute to all aspects of plant responses towards biotic and abiotic stimuli, which have been widely studied for their antimicrobial properties and their role in signalling during defence reactions^[49,50]. Phenylalanine ammonia-lyase (PAL) catalyzes the first step of the phenylpropanoid pathway and produces precursors for a variety of important secondary metabolites, which is a key enzyme involved in plant defense against pathogens and insects^[51,52]. The CYP75 gene family is composed of two subfamilies, i.e., CYP75A (flavonoid 3',5'hydroxylase, F3'5'H), CYP75A) and CYP75B (flavonoid 3'-hydroxylase, F3'H), which involves in the biosynthesis of the majority of plant secondary metabolites in adaptation to biotic and



Fig. 1 Distribution of TD genes and their evolutionary impact on *V. vinifera* genome. (a) Distribution of TD genes on 19 chromosomes. The same color on the same chromosome represents TD genes from the same family. (b) Harp illustration of gene numbers between multi-copy notTD-families and TD-families. (c) The linear regression analysis between the total number of genes and the number of TD genes in 960 TD-families (y = 1.48018x + 1.50766, $R^2 = 0.5423$, $p = 5.75 \times 10^{-165}$). The X-axes and Y-axes represent the number of tandem duplicated genes and all genes in 960 TD-families, respectively. The color depth of the circles is consistent with the total number of genes in the corresponding family. The size of the circle is consistent with the total number of genes in all corresponding families. (d) Scatterplot of KEGG enrichment for 5,341 TD genes (p < 0.01).

abiotic stress^[53,54]. Chalcone synthase (CHS) is the first key enzyme in the flavonoid pathway, which catalyzes the stepwise condensation of three acetate moieties from malonylcoenzyme A (CoA) with 4-coumaroyl-CoA to give 4', 2', 4', 6'tetrahydroxy-chalcone^[55]. Many studies have shown that overexpression of CHS genes can increase resistance to pests and pathogens^[56-58]. Our further analysis showed that the vast majority of CYP75 genes and chalcone synthase genes in the flavonoid biosynthetic pathway (map00941) are tandem duplicated, while in phenylpropanoid biosynthesis pathway, there are a large number of tandem duplicated phenylalanine ammonia-lyase (PAL), beta-glucosidase, cinnamyl-alcohol dehydrogenase and peroxidase genes (map00940) (Supplemental Fig. S2, S3 & Table 1, Supplemental Table S3). Based on conserved domains, we further individually annotated the key synthetases, terpene synthase (TPS) genes and the stilbene synthase (STS) genes involved in the biosynthesis of terpenes and stilbenes, respectively. This analysis revealed that up to 89.13% (41/46) of *TPS* genes and 76.36% (42/55) of *STS* genes are tandem duplicated (Supplemental Table S3).

In addition, plant hormone signal transduction (map04075) and plant-pathogen interaction (map04626) pathways, which were closely related to disease resistance response (Fig. 1d & Supplemental Table S2)^[59], were also found to be significantly enriched in TD genes. Programmed cell death (PCD) is of central importance in plant-microbe interactions^[59,60]. Small Auxin Up RNA (*SAUR*) genes are early auxin-responsive genes which involved in leaf senescence and death^[61]. Our analysis indicated that there are a large number of tandem duplicated *SAUR* genes, pathogenesis-related genes, and disease resistance genes in these two pathways (Supplemental Figs S4, S5 & Supplemental Table S2, S3). In addition, it is well known that NBS (nucleotide binding site)-type disease-resistance genes play an important role in the response of grapevine to

Knumber	Annotation	All count	TD genes	Ratio (%)
phenylpropanoid biosynthesis (map00940)				
K00083	CAD; cinnamyl-alcohol dehydrogenase [EC:1.1.1.195]	23	11	47.83
K00430	peroxidase [EC:1.11.1.7]	82	36	43.90
K00588	caffeoyl-CoA O-methyltransferase [EC:2.1.1.104]	5	2	40.00
K01188	beta-glucosidase [EC:3.2.1.21]	33	27	81.82
K01904	4CL; 4-coumarateCoA ligase [EC:6.2.1.12]	7	2	28.57
K05349	bglX; beta-glucosidase [EC:3.2.1.21]	8	4	50.00
K05350	bglB; beta-glucosidase [EC:3.2.1.21]	5	2	40.00
K06892	F6H; feruloyl-CoA 6-hydroxylase [EC:1.14.11.61]	2	2	100.00
K10775	PAL; phenylalanine ammonia-lyase [EC:4.3.1.24]	19	11	57.89
K11188	PRDX6; peroxiredoxin 6 [EC:1.11.1.7 1.11.1.27 3.1.1]	3	2	66.67
K13065	HCT; shikimate O-hydroxycinnamoyltransferase [EC:2.3.1.133]	7	3	42.86
K13066	COMT; caffeic acid 3-O-methyltransferase [EC:2.1.1.68]	13	4	30.77
flavonoid biosynthesis (map00941)				
K00588	caffeoyl-CoA O-methyltransferase [EC:2.1.1.104]	5	2	40.00
K00660	CHS; chalcone synthase [EC:2.3.1.74]	43	31	72.09
K05278	FLS; flavonol synthase [EC:1.14.20.6]	4	4	100.00
K05280	CYP75B1; flavonoid 3'-monooxygenase [EC:1.14.14.82]	2	2	100.00
K13065	HCT; shikimate O-hydroxycinnamoyltransferase [EC:2.3.1.133]	7	3	42.86
K13082	DFR; bifunctional dihydroflavonol 4-reductase/flavanone 4-reductase [EC:1.1.1.219 1.1.1.234]	6	3	50.00
K13083	CYP75A; flavonoid 3',5'-hydroxylase [EC:1.14.14.81]	15	12	80.00

pathogenic infection^[29,62,63]. Among the 324 NBS genes annotated, based on conserved domains, TD genes accounted for up to 58.64% (190/324) (Supplemental Table S3). Not only that, but various transcription factors which play an important role in the growth and development and stress response of grapevine^[27,29,64–66] were also found to be enriched in TD genes with 24.7% (37/150) of MYB, 37.5% (72/192) of ERF, 20.5% (15/73) of NAC, 10.5% (6/57) WRKY transcription factor genes being tandem duplicated.

In short, our analysis clearly demonstrates that gene tandem duplication has made major contributions in the expansion of specific gene families related to biotic stress resistance and biosynthesis of various secondary metabolites, and directly affected the family expansion level, as well as the adaptive evolution of *V. vinifera*.

TD genes play a pivotal role in response to *Plasmopara viticola* infection

A study in Drosophila^[66] found that the tandem duplication of the Alcohol dehydrogenase (Adh) gene and an unrelated synthetic reporter gene both appears more than 2-fold higher in expression level than the single-copy gene, and also exhibits greater activity than two copies of the gene in trans. This study then proposed the concept of 'overactivity' and suggested that this overactivy at the expression level of TD genes is a general phenomenon and speculated that the overactivity of TD genes is due to a proximity position effect rather than simply copy number^[66]. However, this hypothesis is only based on individual genes and has not been confirmed in plants. At present, the genome-wide analysis of TD gene expression signatures still lacks systematic attention. More importantly, the differences in the dynamic expression changes and the roles between TD genes and interspersed duplicated genes in response to environmental stimuli, cannot be fully reflected by the expression characteristics under a single specific condition. Considering the importance of the TD genes in the adaptive evolution of V. vinifera genome, we then sought to use V. vinifera as a model to explore these unsolved questions. To this end, while considering the important impact of grapevine downy mildew (DM)

caused by the oomycete *P. viticola* on the viticulture worldwide^[67], we investigated the dynamic expression characteristics of TD genes by analyzing our transcriptome data of grape leaves at different time points after *P. viticola* infection.

We first identified 1,330 non-redundant DEGs distributed on the 19 V. vinifera chromosomes, which were significantly differentially expressed at any specific time point within the first 36 h, in response to DM inoculation vs Mock (water) inoculation, in either MrRpv1-transgenic Shiraz or wild-type Shiraz. Subsequently, the 1,330 DEGs were classified into 584 TD-DEGs and 746 notTD-DEGs according to whether they were TD genes or not (Supplemental Table S4). Quantitative real-time PCR (qPCR) assays of a set of randomly selected DEGs have confirmed that their expression was in accordance with the transcriptome results, including 18 TD genes and seven notTD genes^[29]. Our subsequent results greatly extend the meaning of 'overactivity'. TD genes played a pivotal role in the response to P. viticola infection through the multifaceted overactivity mentioned next. Firstly, in terms of quantity, while the proportion of TD genes located across the 19 chromosomes was only 19.09%, they accounted for 43.91% of all DEGs responding to P. viticola infection. In other words, TD genes were significantly more abundant in DEGs (t test, $p = 1.59 \times 10^{-54}$; Fig. 2a & Supplemental Fig. S6), including 29 STS genes, 21 CHS genes, 17 GST (glutathione S-transferase) genes, 11 PAL genes, seven chitinase genes and six PR1 (pathogenesis-related protein 1) genes. Second, in terms of scope, TD-DEGs were significantly differentially expressed at more earlier time points and in more treatments post-infection compared to notTD-DEGs, resulting in faster and longer-lasting responses (Fig. 2b, Supplemental Figs S7 & S8; Supplemental Table S4). Third, in terms of amplitude, the fold change of TD-DEGs is significantly higher than that of notTD-DEGs (t test, $p = 1.24 \times 10^{-26}$; Fig. 2c, Supplemental Figs S8 & S9).

Of the 584 TD-DEGs, there were 507, 386 and 554 genes that could be successfully annotated by the KEGG, GO, and PFAM databases, respectively. A KEGG enrichment analysis of the 584 TD-DEGs showed that they were significantly (p < 0.01)



Fig. 2 Expression signature of TD genes. (a) Distribution of TD genes and notTD genes among all genes and DEGs, respectively by proportion. (b) Statistics on the number of notTD-DEGs and TD-DEGs distributed in different number of treatments by quantity. (c) Harp illustration of log2foldChange (DM vs Mock) for TD-DEGs and notTD-DEGs. (d) Scatterplot of KEGG enrichment for TD-DEGs.

enriched in biological pathways related to biotic stress and plant immunity, such as flavonoid biosynthesis; phenylalanine metabolism; glutathione metabolism; biosynthesis of secondary metabolites; phenylpropanoid biosynthesis; plant-pathogen interaction; MAPK signaling pathway; tyrosine metabolism; linoleic acid metabolism; stilbenoid, diarylheptanoid and gingerol biosynthesis; tropane, piperidine and pyridine alkaloid biosynthesis; isoquinoline alkaloid biosynthesis; plant hormone signal transduction (Fig. 2d). Besides, the GO enrichment analysis of the 584 TD-DEGs revealed that genes involved in biological processes related to protein phosphorylation, protein modification process, defense response, defense response to fungus, response to stress, response to biotic stimulus were significantly enriched (p < 0.01). Among the molecular function terms, terms related to plant immunity, including protein kinase activity, phosphotransferase activity, ATP or nucleoside binding, transmembrane signaling receptor activity, ion channel activity were significantly enriched. PFAM enrichment analysis revealed that genes involved in Chalcone and stilbene synthases C-terminal domain and N-terminal domain, Protein kinase domain, Pathogenesis-related protein family, Glycosyl hydrolase family were significantly enriched. From the

TD genes are widely involved in the disease resistance process. In addition, our previous weighted-gene coexpression network analysis (WGCNA) indicated that the black module was the key module because it contains the most DEGs and most genes within this module were strongly induced and played an important role in the MrRPV1-mediated resistance to downy mildew^[29]. Here, we further found that 54.14% (720/1,330) of all non-redundant DEGs are in the black module, of which 50.42% (363/720) are TD-DEGs (Supplemental Fig. S10 & Supplemental Table S5). In particular, as many as five of the top 10 hub genes identified by KME values in the black module are TD genes, namely VIT_08s0058g00860 (Protein LURP-one-related 15, G1139), VIT_14s0081g00030 (Pathogenesis-related protein PR-4, G1904), VIT_16s0050g02210 (Acidic endochitinase, G191), VIT_15s0021g01270 (uncharacterized protein, G1696) and VIT_16s0050g02220 (Acidic endochitinase, G191). Clearly there are significantly more TD-DEGs in this core module compared to notTD-DEGs (t test, $p = 2.41 \times 10^{-7}$).

enrichment results of KEGG, GO and PFAM, it can be seen that

To further confirm that this multifaceted overactivity phenomenon is caused by the position effect between TD genes, rather than the functional differences between TD and notTD genes, we narrowed the comparative analysis to the 310 TD-DEGs and 144 notTD-DEGs in 84 families containing both TD-DEGs and notTD-DEGs. It is clear that after exclusion the interference of the functional differences, it is further confirmed that tandem duplication is a key factor responsible for the multifaceted overactivity phenomenon (Supplemental Figs S11–S14 & Supplemental Tables S6, S7). In conclusion, our results demonstrate the multifaceted overactivity phenomenon of TD genes at the genome-wide level and their essential role in response to *Plasmopara viticola* infection through effective differential changes in expression.

The recent burst of LTR contributes to tandem and interspersed gene duplication

The results of the analysis presented above greatly enhanced our interest in the TD genes. To further clarify their replication times, we identified the reciprocal best-hit (RBH) paralogous gene pairs using blastp with an E-value threshold of $1E-5^{[16,32]}$. The synonymous nucleotide substitution rate (Ks) of the RBH pairs was used as a proxy for divergence time. This identified 4,486 RBH pairs across the 19 chromosomes with ks < 3.

For the convenience of description and further analysis, we then defined the RBH pairs in which both genes were TD genes as 'bothTD' pairs, whereas the pairs in which both genes were notTD genes were defined as 'bothNotTD' pairs. Remaining pairs in which one was a TD gene and the other was not were defined as 'TDnotTD' pairs. Of the 4,486 RBH pairs identified, a total of 1,299 were classified as bothTD pairs which accounted for 48.64% (2,598/5,341) of all previously identified TD genes distributed on the 19 chromosomes, 2,936 as bothNotTD pairs and 251 as TDnotTD pairs (Fig. 3 & Supplemental Table S8).

Interestingly, the ks distribution of all identified 4,486 RBH pairs shows that, in addition to an older WGD peak around 1.4, massive gene duplication between 0-0.2 resulted in another more recent peak around 0.03 (Fig. 3a). It is clear that most of the bothTD pairs were duplicated more recently and accounted for the majority of recent RBH pairs, suggesting that gene tandem duplication is the main mode of gene expansion in recent times (Fig. 3b & Supplemental Table S8). In contrast, most RBH pairs that arose during WGD period are bothNotTD pairs, which is consistent with the mechanism of WGD (Fig. 3c & Supplemental Table S8). A comparison of KEGG enrichment results across all recently duplicated 1,351 pairs, identified 722 bothTD pairs and 536 bothNotTD pairs with ks < 0.2, suggesting that the recent generation of TD genes, but not the notTD genes, was a key factor to the adaptive evolution of V. vinifera (Supplemental Fig. S15), which was consistent with the KEGG enrichment results of all 5,341 TD genes (Fig. 1d).

To explore the reason for the recent burst of gene duplication events in the *V. vinifera* genome, and considering the remarkable impact of LTRs on plant genome evolution, we identified intact LTRs and analyzed their insertion time. As we expected, large-scale insertions of LTRs have also occurred recently and still continue, which is consistent with the recent large-scale gene duplication events. (Supplemental Fig. S16).



Fig. 3 The ks distribution of RBH pairs. (a) All pairs. (b) Both TD pairs. (c) BothNotTD pairs. (d) TD notTD pairs.

We then investigated the sequence similarities between the 2 kb flanking sequences of the recently duplicated 722 bothTD pairs (ks < 0.2) and found that there were 237 pairs with similar 5' or 3' flanking sequences. Of these 237 pairs, 53 were found to have similar 5' and 3' flanking sequences, 85 have similar 5' flanking sequences and 99 have similar 3' flanking sequences (where similar is defined as at least 80% sequence identity across at least 50% of the length^[16]). Next, we found that up to 84.45% (2,194/2,598) of genes within all 1,299 bothTD pairs contained TEs within the 2 kb flanking sequence, of which 1,231 genes contained TEs in both 5' and 3' flanking sequences, another 514 genes contained TEs in 5' flanking sequences, and 449 genes contained TEs in 3' flanking sequences. Among these TEs, LTRs accounted for 71.62%, with Copia the most common, followed by Gypsy. Combined with the recent outbreak of tandem gene duplication, this seems to imply that the production of TD genes may be related to TEs.

Furthermore, based on comparative analysis with other types of RBH pairs, we speculate that the TD gene is highly unlikely to be generated by retrotransposition. Since a hallmark of retrotransposition is an intronless coding region with a poly-A tail, pairs were inferred to be likely retrotransposed duplications if one gene contains only one exon and the other gene contains at least three exons^[68]. Following such stringent criteria, we then individually checked all 1,299 bothTD pairs, 536 recently replicated bothNotTD pairs (ks < 0.2), and 989 bothNotTD pairs during WGD (ks between 1.2-1.8), and identified 21 pairs, 71 pairs and 16 pairs of retrotransposed duplications, respectively. Recently duplicated bothNotTD pairs were the least in number, whereas this category has the most pairs which met the criteria for retrotransposed duplications, implying the importance of retrotransposition for the recent interspersed duplications. In addition, among the 536 recently replicated bothNotTD RBHs, 322 pairs were located on different chromosomes, and another 49 pairs were separated by spacings of over 1Mb. Furthermore, there were 51 pairs with similar 5' and 3' flanking sequences, another 58 pairs with similar 5' flanking sequences, and 74 pairs with similar 3' flanking sequences (defined as at least 80% sequence identity across at least 50% of the length in the 2 kb flanking sequences). Meanwhile, there are 84.14% (902/1,072) genes containing TEs in flanking sequences, of which 516 genes contained TEs in both 5' and 3' flanking sequences, another 210 genes contained TEs in 5' flanking sequences, and 176 genes contained TEs in 3' flanking sequences. Among these TEs, LTRs accounted for 71.93%, with Gypsy the most common, followed by Copia. Taken together, it seems reasonable to speculate that the recent burst of LTR activity may explain the recent generation of a large number of interspersed duplications.

In contrast, while bothTD pairs are present in the highest number, they were found to contain the lowest ratio of retrotransposed duplications. At the same time, considering the flanking sequence features outlined above, the close positional relationship and the presence of very few intron deletions between TD genes, it seems reasonable to speculate that recent LTR insertions may have indirectly promoted the recent outbreak of TD genes by increasing the probability of unequal crossovers in nearby genomic regions, which greatly promoted the adaptive evolution in *V. vinifera*. Moreover, the resulting TD genes even exceeded the number of interspersed duplications generated directly by retrotransposition, in which different LTR subtypes played different dominant roles. The discovery that such a large number of recently duplicated genes have LTR insertions in the upstream promoter regions, we decided to further evaluate the potential impact of LTR insertions on gene regulation and function. To do this, we analysed the transcription factor binding sites (TFBS) in the upstream 1 kb promoter region of 536 bothNotTD pairs (ks < 0.2) and all 1,299 bothTD pairs and then focused on the proportion of TFBS located within the TE/LTR. The results show that TE-embedded motifs accounted for 63.43% (680/1,072) and 64.09% (1,665/2,598), respectively. The vast majority of TEs were LTRs, among which Copia was the most common, followed by Gypsy. This indicates that the insertion of LTRs not only promotes gene duplication, but also may extensively modify gene expression.

Sequence similarity affects distinct expression activity profiles among different gene clusters

The results presented above suggest that the recent outbreak of LTRs is an important reason for the large-scale replication of TD genes and whether a gene is a TD gene seems to determine whether the gene has multifaceted overactivity phenomenon. However, it is important to note the 584 TD-DEGs were derived from 230 TD-families, but there are in fact a total of 2,407 TD genes in these 230 TD-families, which means that only 24.26% display differential gene expression in response to P. viticola infection. This raises two new questions. Firstly, if only the TD properties of genes determine their expression activity, we would expect these 584 DEGs to be relatively randomly and uniformly distributed within the gene clusters of these families. Secondly, since these 2,407 genes are all TD genes, why do only 584 genes show differential expression in response to P. viticola infection, while the remaining 1,823 genes from the same family do not?

The results of the subsequent analysis were somewhat unexpected. In contrast to our speculation, the 584 TD-DEGs were not randomly and uniformly distributed with most of them (64.55%, 377/584) distributed in clusters (defined as containing at least two DEGs in the same gene cluster) and only came from 99 TD-families. These clustered TD-DEGs were designated as 'togetherTD-DEGs'. For example, among the 55 STS genes in the V. vinifera genome, 32 are differentially expressed in response to P. viticola infection, of which 29 are togetherTD-DEGs. We also found that all 11 identified tandem duplicated phenylalanine ammonia-lyase (PAL) genes were significantly differentially expressed. The remaining 207 TD-DEGs were found to be in a scattered distribution and were from as many as 166 gene families (average of 1.25 DEGs per family). These scattered TD-DEGs were designated as 'singleTD-DEGs' (defined as containing only one DEG in the same gene cluster) (Fig. 4). It is worth noting that there are 64 TD-families which all 231 TD-DEGs from these families are all togetherTD-DEGs, accounting for 61.27% (231/377) of all togetherTD-DEGs (Fig. 4). However, there are actually a total of 542 TD genes in these 64 TD-families, which means that, apart from the 231 togetherTD-DEGs, the remaining 311 TD genes are not differentially expressed under any treatments. In conclusion, it would appear that the differential expression of TD genes have the characteristics of selective clustering in response to P. viticola infection.

Further analysis found that togetherTD-DEGs exhibited multifaceted overactivity compared with singleTD-DEGs, including more DEGs (Supplemental Fig. S17 & Supplemental Table S9), a faster and longer lasting response (Fig. 5a &



Fig. 4 The distribution of different type DEGs. (a) Venn diagram of family distribution of 377 togetherTD-DEGs and 207 singleTD-DEGs. Families are shown in bold font. The numbers of singleTD-DEGs and togetherTD-DEGs contained in the corresponding families are directly below. (b) The chromosomal distribution of 2,407 TD genes in 230 gene families containing TD-DEGs. notDEGs, singleTD-DEGs, togetherTD-DEGs are displayed separately.

Supplemental Fig. S18), a significantly higher fold change (t test, $p = 2.91 \times 10^{-7}$; Fig. 5c & d) and significantly more togetherTD-DEGs in core black module (t test, p = 0.00574; Fig. 5b, Supplemental Fig. S19 & Supplemental Table S10). In contrast, the difference between singleTD-DEGs and notTD-DEGs is not obvious, and the former is even slightly inferior in some respects to the latter. For example, in terms of the proportion of differentially expressed genes in more treatments, singleTD-DEGs are slightly less than notTD-DEGs (Fig. 5a).

In conclusion, our results show that not all TD genes are overactive, and different gene clusters have different expression activity profiles, with some containing a large number of overactive togetherTD-DEGs, while some containing a few, scattered and relatively inactive singleTD-DEGs, and some contain no DEGs at all. This suggests that whether a DEG is a TD gene is not the only factor that determines its overactivity, and whether adjacent paralogous genes in the cluster can be differentially expressed synergistically is also an important factor. This raises the question for different gene clusters from the same family, as to why some clusters are synergistically differentially expressed, while the others are not?

We then asked whether the synergistic ability of distinct paralogous gene clusters to be expressed in response to *P. viti*-

cola infection could be explained in part by functional differentiation related to sequence differences within gene clusters. To confirm this, we focused on the above-mentioned 64 TD-families containing only togetherTD-DEGs but no singleTD-DEGs. and selected relatively large gene families from them. The gene clusters formed by TD genes were then divided into two different categories according to whether they contain DEGs: togetherDEGs-clusters and noDEGs-clusters. Maximum-likelihood trees were constructed based on both the predicted protein sequences and the 1,000 nt region upstream of the transcription start sites of all TD genes. In general, the results showed that there are greater differences between, not only the upstream promoters, but also the amino acid sequences between noDEGs-clusters and togetherDEGs-clusters, and within the noDEGs-clusters, while a higher similarity is observed within the togetherDEGs-clusters (Supplemental Figs S20, S21 & S23).

Furthermore, based on the previously identified bothTD RBH pairs, we named the RBH pairs in which both genes are togetherTD-DEGs as 'togetherTD-DEGs RBHs', and RBH pairs in which either of the genes is singleTD-DEG as 'singleTD-DEG RBHs'. Sequence similarity analysis indicated that there are higher similarity both in protein sequences and 1 kb promoter sequences between togetherTD-DEGs RBHs than singleTD-DEG



Fig. 5 Expression signature of togetherTD-DEGs. (a) Statistics on the number of notTD-DEGs, singleTD-DEGs and togetherTD-DEGs distributed in different number of treatments by proportion. (b) Modules distribution of singleTD-DEGs and togetherTD-DEGs of WGCNA analysis by proportion. (c) Harp illustration of log2foldChange for notTD-DEGs, singleTD-DEGs and togetherTD-DEGs. (d) Overall distributions of log2foldChange for notTD-DEGs.

RBHs (Supplemental Fig. S24). Thus, our results suggested that gene clusters with higher homology in upstream promoters and protein sequences can respond more synergistically to *P. viticola* infection and exhibit multifaceted overactivity.

Position effect and synergistic effect of TD genes, especially in response to *P. viticola* infection

Gene duplication will cause the original expression dosage balance to be disrupted. The balance will be achieved again through down-regulation of expression, sub- or neofunctionalization of duplicates, or mutational degradation of one copy^[68,69]. To further dissect the position effect of TD genes more comprehensively and compare the distinct expression signatures and their fates between tandem and interspersed duplicated genes, we analyzed their expression profiles and divided all identified 4,486 RBH pairs into three categories. Gene pairs were defined as asymmetrically expressed duplicates (AEDs) when the expression level of one the genes of the pairs was significantly higher in at least two treatments, and never lower than its sister gene in the other treatments. Gene pairs were defined as potentially sub- or neo-functionalized if the expression level of each gene was significantly higher than that of the other in at least one treatment. The remaining gene pairs were classified as having no differences (no-diff) in expression level^[32,68]. For the following analysis, we confirm that the position effect of TD genes resulted in a higher level of expression synergy and activity, which is particularly important in response to *P. viticola* infection. Here, in order to express this

Fruit

Research

Fruit Research

concept more clearly, we officially named the expression characteristic of the TD genes as their positional effect and synergistic effect.

Although the vast majority of bothTD pairs and bothNotTD pairs are AEDs, the former still have significantly more no-diff pairs than the latter (t test, $p = 3.07 \times 10^{-5}$; Supplemental Fig. S25). Meanwhile, gene expression is significantly more correlated for bothTD pairs than for bothNotTD pairs (t test, $p = 6.00 \times 10^{-13}$; Fig. 6a & Supplemental Fig. S26). Considering that large-scale duplication of bothTD pairs and bothNotTD pairs occurred at different times, we therefore wondered whether the segregation of duplicates contributed to the differential expression between them, or whether the lower expression correlations simply reflected the greater age of bothNotTD pairs. In fact, even controlling for duplicate age and only recently generated (ks < 0.4) bothTD and bothNotTD pairs were

selected, there is also a strong signal that interspersed duplication is a key factor enabling expression divergence (t test, $p = 1.157 \times 10^{-8}$; Supplemental Fig. S27). In other words, the position effect of the TD genes is critical for the higher expression synergy level (or synergistic effect).

Among all RBH pairs, bothTD pairs accounted for a smaller proportion compared with bothNotTD pairs (Fig. 6b). However, further analysis found that bothTD pairs were significantly higher in pairs containing at least one DEG (t test, $p = 1.09 \times 10^{-21}$) and much higher in the pairs whose two genes are both DEGs (Fig. 6b). We also found that the expression correlation of all togetherTD-DEGs RBHs was surprisingly higher than that of singleTD-DEG RBHs and bothNotTD-DEG RBHs (bothNotTD pairs containing DEGs) (Fig. 6c & Supplemental Fig. S28). This is consistent with the previous finding that TD genes can respond more synergistically to *P. viticola* infection.



Fig. 6 Expression properties of different type RBH pairs. (a) Harp illustration of expression correlations between bothTD pairs and bothNotTD pairs, respectively. (b) Proportion of bothTD and bothnotTD RBH pairs among all pairs, pairs containing at least one DEG and pairs whose two genes are both DEGs, respectively. (c) Harp illustration of expression correlations among bothNotTD-DEG RBH pairs, singleTD-DEG RBH pairs, and togetherTD-DEGs RBH pairs, respectively. (d) Overall distributions of expression correlations between differentially expressed WRKY transcription factors and NotTD-DEGs, singleTD-DEGs, togetherTD-DEGs containing WRKY TFBSs in black module, respectively.

Based on the previously identified bothTD RBH pairs, we identified 88 togetherTD-DEGs RBHs, and 109 singleTD-DEG RBHs. Next, we found that there are five families containing both togetherTD-DEGs RBHs and singleTD-DEG RBHs. Comparative analysis between togetherTD-DEGs RBHs and singleTD-DEG RBHs from the same family found that in four of the five families, compared with the latter, the former exhibited higher expression correlation between genes within the gene pairs and multifaceted overactivity (Supplemental Table S11). Not only that, none of the other genes in singleTD-DEG RBHs were DEGs (Supplemental Table S11). This is the most direct and convincing evidence that TD genes with higher synergistic expression levels could respond more synergistically to P. viticola infection and exhibited multifaceted overactivity, since comparisons within gene families maximizes the exclusion of interference caused by differences in gene function among families.

Position effect and synergistic effect of TD genes is ubiquitous

Considering that distance proximity is always present between TD genes within gene clusters, we speculated that the co-expression of TD genes should also be a general phenomenon, not just limited to certain specific situations or tissues (such as in response to *P. viticola* infection or in leaves). To confirm our speculation and exclude the conditional interference of P. *viticola* infection, we separately examined the raw rpkm results of the water-treated mock controls sampled at 12, 18, 24 and 36 h based on the transcriptome data mentioned above. As expected, bothTD pairs did exhibit significantly higher synergistic expression levels than bothNotTD pairs (t test, p = 5.225×10^{-8}). The trend also remains the same even when only recently generated (ks < 0.4) gene pairs were selected for analysis (t test, p = 9.653×10^{-5}).

Furthermore, we further separately examined the gene expression profiles of V. vinifera cv. Cabernet Sauvignon fruits at three different developmental stages (enlargement, midripe, and harvest ripe), and 10 different tissue types collected from flowers of V. vinifera cv Pinot noir plants grown in the vineyard (of which six tissue samples were collected from preanthesis flowers, namely calyptra, calyx, filament, anther, ovary and stigma, and four tissue samples were collected after anthesis: calyx, ovary, stigma, and embryo). Similarly, compared to bothNotTD pairs, bothTD pairs exhibited significantly higher synergistic expression levels whether in fruit or flowers (t test, $p = 1.26 \times 10^{-17}$ and 1.74×10^{-21} , respectively). In addition, we also noticed that the number of significantly differentially expressed bothTD pairs was much lower than bothNotTD pairs in any above-mentioned treatments from leaves, flowers and fruits (Supplemental Table S12). Therefore, the above analysis based on wide variety of gene expression profiles confirmed our hypothesis that the position effect of TD genes is ubiquitous, and TD genes have a higher synergistic expression level than interspersed duplicated genes, irrespective of tissues or conditions.

Higher level of co-regulation and TF regulatory efficiency of TD genes are correlated with coexpression and co-response to stress

Given that gene expression is closely related to gene regulation, one intuitive explanation for the higher co-expression level of TD genes and, in particular, the higher co-response to stress, is that TD genes may have higher level of co-regulation and regulatory efficiency, compared with interspersed duplicated genes. Histone modifications represent the crux of epigenetic gene regulation essential for most biological processes in plants^[70]. As one test of this, we examined the ChIP-seq data from young leaf tissue of *V. vinifera* cv. Pinot Noir grapes with antibodies to three modified histones (H3K4me3, H3K27ac, and H3K4me1) shown to fulfill important roles in eukaryotic organisms. The results indicated that TD genes have a significantly more consistent histone modification level than interspersed duplicated genes (t test, p = 1.871×10^{-11}), which is consistent with the significantly higher co-expression level.

The previous WGCNA analysis based on the expression data of grapes responding to P. viticola infection found that the TD genes tend to be at the core of the regulatory network. As another test, to further analyze how TD genes and interspersed duplicated genes respond to regulation, we focused on the WRKY TFs which play a key regulatory role in the core module (black module) of the regulatory network. A total of nine differentially expressed WRKY transcription factors, as well as 205 togetherTD-DEGs, 87 singleTD-DEGs and 269 notTD-DEGs which contain the WRKY binding site within 1 kb upstream of the start codon, were selected from all DEGs in the black module. Correlation analysis showed that togetherTD-DEGs had significantly higher co-expression level with WRKY transcription factors than singleTD-DEGs and notTD-DEGs (t test, $p = 8.18 \times 10^{-7}$ and 6.79×10^{-18} , respectively; Fig. 6d & Supplemental Fig. S29). In addition, we also tested two differentially expressed MYB transcription factors (MYB15, VIT_05s0049 g01020 and MYB13, VIT_05s0049g01010), as well as 205 togetherTD-DEGs, 93 singleTD-DEGs and 301 notTD-DEGs which contain the MYB binding site within 1 kb upstream of the start codon in the black module. Correlation analysis also yielded consistent results (t test, p = 0.00253 and 9.84e-06, respectively). Thus, these results suggest that TD genes can be regulated more efficiently by WRKY and MYB transcription factors.

The transcription factor VqWRKY31 has been shown to enhance powdery mildew resistance in grapevine through activation of salicylic acid defense signaling and promotion of specific disease resistance-related metabolite synthesis^[47]. To further verify it is a general phenomenon that TD genes can be more efficiently regulated by TFs, we examined the DEGs in VqWRKY31-transgenic V. vinifera cv. Thompson Seedless compared with wild-type Thompson Seedless at 0 h and 24 h after powdery mildew infection, respectively, which is possible to exclude the interference of other factors and more directly peeked into the differences between TD genes and notTD genes due to one single transcription factor regulatory changes. Notably, at 0 h, all 2,801 DEGs were mediated by overexpression of VgWRKY31, including 966 TD-DEGs and 1835 notTD-DEGs, accounting for 18.1% (966/5,341) TD genes and 8.1% (1,835/22,637) notTD genes, respectively. We also observed very similar results at 24 h after powdery mildew infection, with 1,566 TD-DEGs and 3,871 notTD-DEGs, which accounted for 29.3% TD genes and 17.1% notTD genes, respectively. Thus, independent of whether the tissue was infected with powdery mildew or not, the number of differentially expressed TD genes mediated by VqWRKY31 was significantly higher (t test, p = 1.53×10^{-92} for 0 h and 8.77×10^{-85} for 24 h, respectively). Furthermore, TD genes always showed a

Fruit Research

significantly higher level of up-regulated expression than notTD genes (t test, p = 0.00155 for 0 h and 2.65e-11 for 24 h, respectively).

Relative expression balance facilitates the retention of the TD genes

Adequate expression of a gene is critical for the maintenance of its functional importance^[68,69]. This appears to be detrimental to the long-term preservation of minor genes of AEDs, compared to major genes. However, the vast majority of RBHs are asymmetrically expressed (AED) in our transcriptome results. Therefore, we attempted to explore the mechanism for the preservation of minor genes of AEDs by comparing the differences in the differential expression of AED RBHs in *V. vinifera* leaves in response to *P. viticola* infection.

We selected a total of 172 bothTD RBHs and 160 bothNotTD RBHs which contained at least one DEG in response to *P. viticola* infection from all AED RBH pairs. Genes in AED RBHs with relatively high expression levels were designated as AED+, and

those with relatively low expression levels as AED-. The results suggest that there were more differentially expressed AED+ genes compared to AED- genes in response to P. viticola infection, whether for bothTD RBHs or bothNotTD RBHs (Fig. 7a). Furthermore, there were slightly more AED+ genes differentially expressed at earlier time points (Supplemental Table S13). Moreover, the AED+ genes in bothTD RBHs were significantly differentially expressed in more treatments than the AEDgenes in bothTD RBHs (Fig. 7a & b). In contrast, no significant difference was observed between the AED+ genes and the AED- genes in bothNotTD RBHs (Fig. 7a & b). However, compared to the AED+ genes, the AED- genes in bothTD RBHs clearly prevailed in terms of the magnitude of differential expression, with a significantly higher log2foldchange (t test, p = 0.00873; Fig. 7c & d). However, there is no significant difference in the magnitude of differential expression between AED+ and AED- genes in bothNotTD RBHs (t test, p = 0.271; Fig. 7c & d).



Fig. 7 Expression properties of DEGs in AED gene pairs. Distribution of various types of DEGs across different numbers of treatments. (a) By quantity. (b) By proportion. (c) Harp illustration of log2foldChange for various types of DEGs. (d) Overall distributions of log2foldChange for various types of DEGs. bothNotTD-AED-, differentially expressed AED- genes in bothNotTD pairs; bothNotTD-AED+, differentially expressed AED- genes in bothTD pairs; bothTD-AED+, differentially expressed AED+ genes in bothTD pairs.

Discussion

In this study, we showed that gene tandem duplication mediated by LTR retrotransposons played a key role in the adaptive evolution of *V. vinifera*. Not only that, we also found that TD genes showed a position effect and synergistic effect, and their co-response and overactivity to biotic stress. The high co-expression pattern of these TD genes was suspected to be related to their sequence similarity and a higher transcription factor regulatory efficiency.

A better understanding of TD gene expression signatures will guide us in the prediction of which genes may be relatively more important from the same gene family. Our findings not only advance the understanding of the evolution of the *V. vinifera* genome. Based on the positional features of the target genes and/or the sequence characteristics within specific gene clusters, breeders can predict the gene activity, which can further guide phenotype prediction and the directional selection of target loci or genes, to achieve more enhanced traits in future crop breeding work. Furthermore, on the basis of these signatures, the promoter regions of specific genes within the gene clusters which are not synergistically expressed with others could be targeted for gene-editing, to make their sequences consistent with genes with higher activity, and then to better activate the specific gene clusters.

Tandem duplication leads to a higher local concentration of transcription factor binding sites and increases the binding frequency and efficiency of transcription factors^[66,71], which may be the reason why TD genes can be more efficiently regulated by TFs. Our results suggest that TD genes which are closer to each other in proximity than interspersed duplicated genes, generally have a higher level of co-regulation such as histone modification, and can be more efficiently regulated by transcription factors. In addition, evidence from whole-genome chromosome conformation capture (Hi-C) studies in humans suggests that TD genes have higher promoter-promoter interaction, which may reflect a tendency of coregulated genes to be transcribed simultaneously within transcription factories^[68,71,72].

Although it is not certain that TD genes have more important molecular functions than interspersed duplicated genes, the results of our analysis reveal that tandem duplicated genes could have higher level of co-regulation, higher regulatory efficiency, and co-expression, especially efficient co-response to biotic stress. This more effective and appropriate expression is indeed important for environmental adaptation. It is conceivable that offspring with a greater accumulation of TD genes would have significant advantages in response to environmental stress, that their selective retention naturally became an inevitable choice for plant adaptive evolution. This may be why we found so many TD genes in the genome. Future analyses based on more species will help to further confirm the universality of the evolution dynamics of TD genes. And awareness of this will also accelerate our future breeding speed and efficiency.

Dose balance models of gene expression focus on the importance of maintaining the correct expression dose among different genes after gene duplication occurs^[69,73,74], and provide a good explanation for why gene copies are preserved, because subsequent gene loss would disrupt the dose balance^[69,75]. Our findings have shown that, compared to interspersed duplicated genes, among tandem duplicated genes, although the expression of the AED+ genes are dominant in many aspects, the AED- genes still have their own irreplaceable superiority, such as higher up-regulation fold. This seems to indicate that when a tandem duplicated gene is produced, the dosage balance between it and its copy may be maintained in this way, which may be beneficial to provide a relatively reduced constraint due to their combined expression^[68,75,76]. This kind of dosage balance is conducive to making the roles of each tandem duplicated gene indispensable, thereby ensuring longterm survival, rather than being cleared. This is especially true for the AED- genes, opening the possibility for further functional differentiation in the future. Recent research has also found that, after the mutation of one gene copy, the other copy from the same family can compensate for its loss of function and ensure the robustness of the function^[77]. The dosage balance between closely-adjacent tandem duplicated genes appears to be better than that between distant interspersed duplicated genes, which, we speculate, may also be related to their position and synergistic effect. In contrast, we surmise that those genes that are consistently relatively disadvantaged in expression, especially for interspersed disadvantaged genes, have a greater probability of being lost or pseudogenized in the future due to their less important functions. All these findings offer new understandings of the evolution of the grapevine genome as well as TD genes.

Materials and methods

Genome and transcriptome data sources

Genome sequences, gene sequences and general feature format (GFF) files of *V. vinifera* cv. PN40024 were downloaded from https://urgi.versailles.inra.fr/Species/Vitis/Annotations. *MrRPV1* is a typical TIR-NBS-LRR type DM disease resistance gene cloned from the wild North American grapevine species *Muscadinia rotundifolia*. Leaves of *MrRpv1*-transgenic Shiraz and wild-type Shiraz inoculated with DM sporangia or water at 12, 18, 24 and 36 h were used for transcriptome analysis. We subjected the expression data to pairwise comparisons, i.e., S_DM vs S_Mock and TS_DM vs TS_Mock, at different time points (https://www.nature.com/articles/s41438-021-00597-w).

Paired-end clean reads were aligned to the reference Grapevine genome PN40024 (GenBank assembly accession No: GCA_000003745.2) using TopHat v2.0.9. The proportion of unique mapped reads in all samples was very high (88.69%-91.26%, above 90% in most samples). To ensure the accurate quantification of the expression levels of homologous copies with similar sequences, only unique mapped reads were used for further analysis^[68]. HTSeq v0.6.1 was used to count the read numbers mapped to each gene. DESeq R package (1.10.1) was used for differential expression analysis. Genes with an adjusted P-value < 0.05 were assigned as differentially expressed.

The expression profiles of 10 different tissues collected from flowers of *V. vinifera* cv Pinot noir plants grown in open fields, the ChIP-seq data from young leaf tissue of Pinot Noir grapes with antibodies to three modified histones (H3K4me3, H3K27ac, and H3K4me1), and the DEGs in *VqWRKY31*-transgenic V. vinifera 'Thompson Seedless' compared with wild-type 'Thompson Seedless' at 0 h and at 24 h after powdery mildew infection can be obtained from public data^[47,65,78].

Identification and analysis of gene families and TD genes

Gene families were identified using OrthoMCL with default parameters based on blastp result generated by DIAMOND with the threshold of E-value of 1e-5 and min coverage \geq 40%. The minimum gene family size is 1. KEGG enrichment analysis (p < 0.01) was performed using the OmicShare tools, a free online platform for data analysis (https://www.omicshare.com/ tools). Maximum-likelihood trees were constructed using MEGA 7 (version 7.0.14) with the muscle and 100 bootstrap replicates for each alignment.

Identification of NBS, TPS and STS genes

The gene domain were identified by pfam_scan.pl (http://ftp. ebi.ac.uk/pub/databases/Pfam/Tools/) based on pfam (http:// pfam.xfam.org/) database. Paircoil2 (http://cb.csail.mit.edu/ cb/paircoil2/) was used to predict the parallel coiled coil (CC) fold from sequence. The genes with TIR (PF01582), NB-ARC (PF00931) and LRR domains were classified as TIR NBS LRR, genes with TIR (PF01582) and NB-ARC (PF00931) domains were classified as TIR_NBS, genes with NB-ARC (PF00931) and LRR domains were classified as NBS_LRR. The genes with CC structure, NB-ARC (PF00931) and LRR domain were classified as CC_NBS_LRR, genes with CC structure and NB-ARC (PF00931) domain were classified as CC_NBS, the remaining genes with only NB-ARC (PF00931) domain were classified as NBS. The gene with Terpene_synth (PF01397) and/or Terpene_synth_C (PF03936) domains was identified as TPS gene. The gene with Chal_sti_synt_N(PF00195.18) and/or Chal_sti_synt_C(PF02797. 14) domains was identified as STS gene.

Identification and analysis of RBH pairs and intact LTR retrotransposons

We performed an all-versus-all comparison of whole genome protein sequences to find reciprocal best hits (RBH) pairs using diamond with the threshold of E-value of 1e-5. Sequence alignment of CDS sequences of RBH pairs was performed using muscle, and finally Ks values between gene pairs were calculated using the YN model in KaKs_Calculator. Ks values >3.0 indicate saturated substitutions at synonymous sites and those gene pairs were excluded from further analysis. The Ks distribution was plotted and displayed using R (version 4.1.2). The significant differential expression analysis between two genes in the RBH gene pairs were performed using the original FPKM through the T test analysis tool provided by OmicShare tools (https://www.omicshare.com/tools/, FDR < 0.05).

LTR_Finder v1.07 and LTRharvest v1.5.8^[79,80] were used to perform *de novo* search for intact LTR retrotransposons against the genome sequences. The two ends of these LTR retrotransposons were aligned with MUSCLE v3.8.31^[81] and the nucleotide divergence rate (λ) between the two LTRs was filtered when more than 0.75. The genetic distance (K) was calculated by K = -0.75ln(1-4 λ /3).

Transposable elements annotation

Transposable elements (TEs) in the *V. vinifera* genome were searched by combining the *de novo* approach and the homology based approaches. For the *de novo* approach, we used RepeatModeler, LTR_FINDER (http://tlife.fudan.edu.cn/ltr_fin der/), Piler (http://www.drive5.com/piler/) and RepeatScout (http://www.repeatmasker.org/) to build a de novo repeat library. For the homology based approach, we used Repeat-Masker (version 3.3.0) against the Repbase TE library and used

RepeatProteinMask against the TE protein database, respectively.

Transcription factors, TFBS prediction and analysis

The genome-wide annotation of MYB, ERF, NAC, WRKY transcription factors was based on plantTFDB, swissprot and pfam databases.

The 1 kb sequences in front of the start codon of all genes in the *V. vinifera* genome was extracted as the promoter sequence. Then, motif information files of plant TFs were downloaded from the JASPAR database (https://jaspar.genereg. net/downloads/). Finally, using the local FIMO subprogram of MEME (https://meme-suite.org/meme/tools/fimo), the prediction results of TF binding sites (TFBS) in the promoter region of the whole genome were obtained. Combining TFBS results and LTR results, TFBS located within LTR were identified using bedtools.

Histone modification level analysis

The three histone modification levels of each gene were measured separately by the total peak length (the sum of the peak length of all peaks located in the gene region and the 1 kb promoter region, results for three histones are calculated separately). Correlations of histone modification levels between gene pairs were then analyzed.

Data availability

Genome sequences, gene sequences and general feature format (GFF) files of *V. vinifera* cv. PN40024 can be downloaded from https://urgi.versailles.inra.fr/Species/Vitis/Annotations. The raw transcriptome sequencing data relevant to this study can be found at the NCBI repository under the following accession number: PRJNA706058.

Acknowledgments

We thank Ian Dry (CSIRO) for his professional language polishing and Hainan Zhao and Kui Li for their advice on manuscript writing. This work was supported by the National Natural Science Foundation of China (Grant No. 31860493), the Special Fund for the Central Government Guides Local Science and Technology Development (Guike ZY21195039), Guangxi Key R&D Program Project (GuiKe AB21076001) and the Science and Technology Development Fund of Guangxi Academy of Agricultural Sciences (2021YT121).

Conflict of interest

The authors declare that they have no conflict of interest.

Supplementary Information accompanies this paper at (https://www.maxapress.com/article/doi/10.48130/FruRes-2023-0016)

Dates

Received 4 May 2023; Accepted 25 June 2023; Published online 13 July 2023

References

1. Conant GC, Wolfe KH. 2008. Turning a hobby into a job: how duplicated genes find new functions. *Nature Reviews Genetics* 9:938–50

- Innan H, Kondrashov F. 2010. The evolution of gene duplications: classifying and distinguishing between models. *Nature Reviews Genetics* 11:97–108
- 3. Kaessmann H. 2010. Origins, evolution, and phenotypic impact of new genes. *Genome Research* 20:1313–26
- 4. Zhang J. 2003. Evolution by gene duplication: an update. *Trends in Ecology & Evolution* 18:292–98
- Bailey JA, Gu Z, Clark RA, Reinert K, Samonte RV, et al. 2002. Recent segmental duplications in the human genome. *Science* 297:1003–7
- Marques-Bonet T, Kidd JM, Ventura M, Graves TA, Cheng Z, et al. 2009. A burst of segmental duplications in the genome of the African great ape ancestor. *Nature* 457:877–81
- Panchy N, Lehti-Shiu M, Shiu SH. 2016. Evolution of gene duplication in plants. *Plant Physiology* 171:2294–316
- 8. Liu C, Wu Y, Liu Y, Yang L, Dong R, et al. 2021. Genome-wide analysis of tandem duplicated genes and their contribution to stress resistance in pigeonpea (*Cajanus cajan*). *Genomics* 113:728–35
- Hu Y, Wu X, Jin G, Peng J, Leng R, et al. 2021. Rapid genome evolution and adaptation of *Thlaspi arvense* mediated by recurrent RNAbased and tandem gene duplications. *Frontiers in Plant Science* 12:772655
- Qiao X, Li Q, Yin H, Qi K, Li L, et al. 2019. Gene duplication and evolution in recurring polyploidization–diploidization cycles in plants. *Genome Biology* 20:38
- Hanada K, Zou C, Lehti-Shiu MD, Shinozaki K, Shiu SH. 2008. Importance of lineage-specific expansion of plant tandem duplicates in the adaptive response to environmental stimuli. *Plant Physiology* 148:993–1003
- 12. Salojärvi J, Smolander OP, Nieminen K, Rajaraman S, Safronov O, et al. 2017. Genome sequencing and population genomic analyses provide insights into the adaptive landscape of silver birch. *Nature Genetics* 49:904–12
- Zhang A, Xiong Y, Fang J, Jiang X, Wang T, et al. 2022. Diversity and functional evolution of terpene synthases in Rosaceae. *Plants* 11:736
- Choulet F, Alberti A, Theil S, Glover N, Barbe V, et al. 2014. Structural and functional partitioning of bread wheat chromosome 3B. *Science* 345:1249721
- Schnable PS, Ware D, Fulton RS, Stein JC, Wei F, et al. 2009. The B73 maize genome: complexity, diversity, and dynamics. *Science* 326:1112–15
- Zhao G, Zou C, Li K, Wang K, Li T, et al. 2017. The Aegilops tauschii genome reveals multiple impacts of transposons. *Nature Plants* 3:946–55
- 17. Casola C, Betrán E. 2017. The genomic impact of gene retrocopies: what have we learned from comparative genomics, population genomics, and transcriptomic analyses? *Genome Biology and Evolution* 9:1351–73
- Hirsch CD, Springer NM. 2017. Transposable element influences on gene expression in plants. *Biochimica et Biophysica Acta (BBA)* -*Gene Regulatory Mechanisms* 1860:157–65
- Bennetzen JL. 2007. Patterns in grass genome evolution. Current Opinion in Plant Biology 10:176–81
- 20. Elert E. 2014. Rice by the numbers: a good grain. *Nature* 514:S50–S51
- Wang W, Zheng H, Fan C, Li J, Shi J, et al. 2006. High rate of chimeric gene origination by retroposition in plant genomes. *The Plant Cell* 18:1791–802
- Zhu Z, Tan S, Zhang Y, Zhang Y. 2016. LINE-1-like retrotransposons contribute to RNA-based gene duplication in dicots. *Scientific Reports* 6:24755
- Kaessmann H, Vinckenbosch N, Long M. 2009. RNA-based gene duplication: mechanistic and evolutionary insights. *Nature Reviews Genetics* 10:19–31
- 24. Stritt C, Wyler M, Gimmi EL, Pippel M, Roulin AC. 2020. Diversity, dynamics and effects of long terminal repeat retrotransposons in the model grass *Brachypodium distachyon*. *New Phytologist* 227:1736–48

Qu et al. Fruit Research 2023, 3:16

- Vitte C. 2003. Formation of solo-LTRs through unequal homologous recombination counterbalances amplifications of LTR retrotransposons in rice Oryza sativa L. Molecular Biology and Evolution 20:528–40
- 26. Jones JDG, Dangl JL. 2006. The plant immune system. *Nature* 444:323–29
- 27. Jiang C, Wang D, Zhang J, Xu Y, Zhang C, et al. 2021. VqMYB154 promotes polygene expression and enhances resistance to pathogens in Chinese wild grapevine. *Horticulture Research* 8:151
- Mine A, Seyfferth C, Kracher B, Berens ML, Becker D, et al. 2018. The defense phytohormone signaling network enables rapid, highamplitude transcriptional reprogramming during effector-triggered immunity. *The Plant Cell* 30:1199–219
- 29. Qu J, Dry I, Liu L, Guo Z, Yin L. 2021. Transcriptional profiling reveals multiple defense responses in downy mildew-resistant transgenic grapevine expressing a TIR-NBS-LRR gene located at the *MrRUN1/MrRPV1* locus. *Horticulture Research* 8:161
- Wan R, Guo C, Hou X, Zhu Y, Gao M, et al. 2021. Comparative transcriptomic analysis highlights contrasting levels of resistance of Vitis vinifera and Vitis amurensis to Botrytis cinerea. Horticulture Research 8:103
- Kim S, Park J, Yeom SI, Kim YM, Seo E, et al. 2017. New reference genome sequences of hot pepper reveal the massive evolution of plant disease-resistance genes by retroduplication. *Genome Biol*ogy 18:210
- 32. Li K, Jiang W, Hui Y, Kong M, Feng L, et al. 2021. Gapless indica rice genome reveals synergistic contributions of active transposable elements and segmental duplications to rice genome evolution. *Molecular Plant* 14:1745–56
- Jaillon O, Aury JM, Noel B, Policriti A, Clepet C, et al. 2007. The grapevine genome sequence suggests ancestral hexaploidization in major angiosperm phyla. *Nature* 449:463–67
- Wang Y, Xin H, Fan P, Zhang J, Liu Y, et al. 2021. The genome of Shanputao (*Vitis amurensis*) provides a new insight into cold tolerance of grapevine. *The Plant Journal* 105:1495–506
- 35. Cheng J, Wang X, Liu X, Zhu X, Li Z, et al. 2021. Chromosome-level genome of Himalayan yew provides insights into the origin and evolution of the paclitaxel biosynthetic pathway. *Molecular Plant* 14:1199–209
- Lorrain B, Ky I, Pechamat L, Teissedre PL. 2013. Evolution of analysis of polyhenols from grapes, wines, and extracts. *Molecules* 18:1076–100
- Matarese F, Cuzzola A, Scalabrelli G, D'Onofrio C. 2014. Expression of terpene synthase genes associated with the formation of volatiles in different organs of *Vitis vinifera*. *Phytochemistry* 105:12–24
- Šikuten I, Štambuk P, Andabaka Ž, Tomaz I, Marković Z, et al. 2020. Grapevine as a rich source of polyphenolic compounds. *Molecules* 25:5604
- Hansen SC, Stolter C, Imholt C, Jacob J. 2016. Plant secondary metabolites as rodent repellents: a systematic review. *Journal of Chemical Ecology* 42:970–83
- Piasecka A, Jedrzejczak-Rey N, Bednarek P. 2015. Secondary metabolites in plant innate immunity: conserved function of divergent chemicals. *New Phytologist* 206:948–64
- 41. Pang Z, Chen J, Wang T, Gao C, Li Z, et al. 2021. Linking plant secondary metabolites and plant microbiomes: a review. *Frontiers in Plant Science* 12:621276
- 42. Block AK, Vaughan MM, Schmelz EA, Christensen SA. 2019. Biosynthesis and function of terpenoid defense compounds in maize (*Zea mays*). *Planta* 249:21–30
- Fabisch T, Gershenzon J, Unsicker SB. 2019. Specificity of herbivore defense responses in a woody plant, black poplar (*Populus nigra*). Journal of Chemical Ecology 45:162–77
- 44. Mahatma MK, Thawait LK, Jadon KS, Thirumalaisamy PP, Bishi SK, et al. 2021. Metabolic profiling for dissection of late leaf spot disease resistance mechanism in groundnut. *Physiology and Molecular Biology of Plants* 27:1027–41

Fruit Research

- 45. Veremeichik GN, Grigorchuk VP, Butovets ES, Lukyanchuk LM, Brodovskaya EV, et al. 2021. Isoflavonoid biosynthesis in cultivated and wild soybeans grown in the field under adverse climate conditions. *Food Chemistry* 342:128292
- 46. Yang X, Gu X, Ding J, Yao L, Gao X, et al. 2022. Gene expression analysis of resistant and susceptible rice cultivars to sheath blight after inoculation with *Rhizoctonia solani*. *BMC Genomics* 23:278
- 47. Yin W, Wang X, Liu H, Wang Y, Nocker S, et al. 2022. Overexpression of VqWRKY31 enhances powdery mildew resistance in grapevine by promoting salicylic acid signaling and specific metabolite synthesis. Horticulture Research 9:uhab064
- 48. Bauters L, Stojilković B, Gheysen G. 2021. Pathogens pulling the strings: Effectors manipulating salicylic acid and phenylpropanoid biosynthesis in plants. *Molecular Plant Pathology* 22:1436–48
- 49. Vogt T. 2010. Phenylpropanoid biosynthesis. *Molecular Plant* 3:2–20
- 50. Yadav V, Wang Z, Wei C, Amo A, Ahmed B, et al. 2020. Phenylpropanoid pathway engineering: an emerging approach towards plant defense. *Pathogens* 9:312
- 51. He J, Liu Y, Yuan D, Duan M, Liu Y, et al. 2020. An R2R3 MYB transcription factor confers brown planthopper resistance by regulating the phenylalanine ammonia-lyase pathway in rice. *Proceedings of the National Academy of Sciences of the United States of America* 117:271–77
- 52. Huang J, Gu M, Lai Z, Fan B, Shi K, et al. 2010. Functional analysis of the Arabidopsis *PAL* gene family in plant growth, development, and response to environmental stress. *Plant Physiology* 153:1526–38
- 53. Morant M, Jørgensen K, Schaller H, Pinot F, Møller BL, et al. 2007. CYP703 is an ancient cytochrome P450 in land plants catalyzing inchain hydroxylation of lauric acid to provide building blocks for sporopollenin synthesis in pollen. *The Plant Cell* 19:1473–87
- 54. Tanaka Y. 2006. Flower colour and cytochromes P450. *Phytochem-istry Reviews* 5:283–91
- 55. Petrussa E, Braidot E, Zancani M, Peresson C, Bertolini A, et al. 2013. Plant flavonoids—biosynthesis, transport and involvement in stress responses. *International Journal of Molecular Sciences* 14:14950–73
- 56. Król P, Igielski R, Pollmann S, Kępczyńska E. 2015. Priming of seeds with methyl jasmonate induced resistance to hemi-biotroph *Fusarium oxysporum* f.sp. *lycopersici* in tomato via 12-oxo-phytodienoic acid, salicylic acid, and flavonol accumulation. *Journal of Plant Physiology* 179:122–32
- 57. Lu Y, Chen Q, Bu Y, Luo R, Hao S, et al. 2017. Flavonoid accumulation plays an important role in the rust resistance of *Malus* plant leaves. *Frontiers in Plant Science* 8:1286
- 58. Zuk M, Działo M, Richter D, Dymińska L, Matuła J, et al. 2016. halcone synthase (CHS) gene suppression in flax leads to changes in wall synthesis and sensing genes, cell wall chemistry and stem morphology parameters. *Frontiers in Plant Science* 7:894
- Wang Y, Tyler BM, Wang Y. 2019. Defense and counterdefense during plant-pathogenic oomycete infection. *Annual Review of Microbiology* 73:667–96
- Dickman MB, Fluhr R. 2013. Centrality of host cell death in plantmicrobe interactions. *Annual Review of Phytopathology* 51:543–70
- 61. Hou K, Wu W, Gan S. 2013. *SAUR36*, a Small Auxin Up RNA gene, is involved in the promotion of leaf senescence in Arabidopsis. *Plant Physiology* 161:1002–09
- 62. Feechan A, Anderson C, Torregrosa L, Jermakow A, Mestre P, et al. 2013. Genetic dissection of a TIR-NB-LRR locus from the wild North American grapevine species *Muscadinia rotundifolia* identifies paralogous genes conferring resistance to major fungal and oomycete pathogens in cultivated grapevine. *The Plant Journal* 76:661–74
- 63. Williams SJ, Yin L, Foley G, Casey LW, Outram MA, et al. 2016. Structure and function of the TIR domain from the grape NLR protein RPV1. *Frontiers in Plant Science* 7:1850

- 64. Vannozzi A, Wong DCJ, Höll J, Hmmam I, Matus JT, et al. 2018. Combinatorial regulation of stilbene synthase genes by WRKY and MYB transcription factors in grapevine (*Vitis vinifera* L.). *Plant and Cell Physiology* 59:1043–59
- 65. Vannozzi A, Palumbo F, Magon G, Lucchin M, Barcaccia G. 2021. The grapevine (*Vitis vinifera* L.) floral transcriptome in Pinot noir variety:identification of tissue-related gene networks and whorlspecific markers in pre- and post-anthesis phases. *Horticulture Research* 8:200
- 66. Loehlin DW, Carroll SB. 2016. Expression of tandem gene duplicates is often greater than twofold. *Proceedings of the National Academy of Sciences of the United States of America* 113:5988–92
- Kamoun S, Furzer O, Jones JDG, Judelson HS, Ali GS, et al. 2015. The Top 10 oomycete pathogens in molecular plant pathology. *Molecular Plant Pathology* 16:413–34
- Lan X, Pritchard JK. 2016. Coregulation of tandem duplicate genes slows evolution of subfunctionalization in mammals. *Science* 352:1009–13
- 69. Conant GC, Birchler JA, Pires JC. 2014. Dosage, duplication, and diploidization: clarifying the interplay of multiple models for duplicate gene evolution over time. *Current Opinion in Plant Biology* 19:91–98
- Li G, Jagadeeswaran G, Mort A, Sunkar R. 2017. ChIP-seq analysis for identifying genome-wide histone modifications associated with stress-responsive genes in plants. *Methods in Molecular Biology* 1631:139–49
- Feuerborn A, Cook PR. 2015. Why the activity of a gene depends on its neighbors. *Trends in Genetics* 31:483–90
- Rao SSP, Huntley MH, Durand NC, Stamenova EK, Bochkov ID, et al. 2014. A 3D map of the human genome at kilobase resolution reveals principles of chromatin looping. *Cell* 159:1665–80
- Qian W, Liao B, Chang AYF, Zhang J. 2010. Maintenance of duplicate genes and their functional redundancy by reduced expression. *Trends in Genetics* 26:425–30
- Stoltzfus A. 1999. On the possibility of constructive neutral evolution. *Journal of Molecular Evolution* 49:169–181
- Gout JF, Lynch M. 2015. Maintenance and loss of duplicated genes by dosage subfunctionalization. *Molecular Biology and Evolution* 32:2141–48
- 76. Popadin KY, Gutierrez-Arcelus M, Lappalainen T, Buil A, Steinberg J, et al. 2014. Gene age predicts the strength of purifying selection acting on gene expression variation in humans. *The American Journal of Human Genetics* 95:660–74
- 77. Kwon CT, Tang L, Wang X, Gentile I, Hendelman A, et al. 2022. Dynamic evolution of small signalling peptide compensation in plant stem cell control. *Nature Plants* 8:346–55
- 78. Schwope R, Magris G, Miculan M, Paparelli E, Celii M, et al. 2021. Open chromatin in grapevine marks candidate CREs and with other chromatin features correlates with gene expression. *The Plant Journal* 107:1631–47
- 79. Ellinghaus D, Kurtz S, Willhoeft U. 2008. *LTRharvest*, an efficient and flexible software for *de novo* detection of LTR retrotransposons. *BMC Bioinformatics* 9:18
- Xu Z, Wang H. 2007. LTR_FINDER: an efficient tool for the prediction of full-length LTR retrotransposons. *Nucleic Acids Research* 35:W265–W268
- 81. Edgar RC. 2004. MUSCLE: multiple sequence alignment with high accuracy and high throughput. *Nucleic Acids Research* 32:1792–97

Copyright: © 2023 by the author(s). Published by Maximum Academic Press, Fayetteville, GA. This article is an open access article distributed under Creative Commons Attribution License (CC BY 4.0), visit https://creativecommons.org/licenses/by/4.0/.