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ARTICLE Comparative transcriptomics of Central Asian Vitis vinifera accessions reveals distinct defense strategies against powdery mildew

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Grape powdery mildew (PM), caused by the biotrophic ascomycete *Erysiphe necator*, is a devastating fungal disease that affects most *Vitis vinifera* cultivars. We have previously identified a panel of *V. vinifera* accessions from Central Asia with partial resistance to PM that possess a *Ren1*-like local haplotype. In this study, we show that in addition to the typical *Ren1*-associated late post-penetration resistance, these accessions display a range of different levels of disease development suggesting that alternative alleles or additional genes contribute to determining the outcome of the interaction with the pathogen. To identify potential *Ren1*-dependent transcriptional responses and functions associated with the different levels of resistance, we sequenced and analyzed the transcriptomes of these Central Asian accessions at two time points of PM infection. Transcriptomes were compared to identify constitutive differences and PM-inducible responses that may underlie their disease resistant phenotype. Responses to *E. necator* in all resistant accessions were characterized by an early up-regulation of 13 genes, most encoding putative defense functions, and a late down-regulation of 32 genes, enriched in transcriptional regulators and protein kinases. Potential *Ren1*-dependent responses included a hotspot of co-regulated genes on chromosome 18. We also identified 81 genes whose expression levels and dynamics correlated with the phenotypic differences between the most resistant accessions 'Karadzhandahal', DVIT3351.27, and O34-16 and the other genotypes. This study provides a first exploration of the functions associated with varying levels of partial resistance to PM in *V. vinifera* accessions that can be exploited as sources of genetic resistance in grape breeding programs.

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INTRODUCTION

The ascomycete *Erysiphe necator* can parasitize any green tissue of a grapevine causing a disease known as grape powdery mildew (PM, henceforth). Decline in leaf photosynthetic capacity¹ and reduction in berry quality² are typical symptoms of the disease. All commercial *Vitis vinifera* cultivars are susceptible to PM forcing grape growers to apply frequent and costly fungicide treatments throughout the growing season. In the European Union over 80 000 tons of fungicides are applied annually to control PM, which corresponds to about 67% of the total fungicides used for all crops, although only 3.3% of the agricultural land is dedicated to grape production.³ In California as much as 20% of the costs associated with wine grape cultivation are related to PM control.⁴ Excessive fungicide use is not only detrimental to the environment and human health but it also increases selection pressure on pathogen populations to adapt and acquire increasing levels of fungicide resistance.⁵

Erysiphe necator is considered to have originated in North America and is currently found in all grape-growing regions in the Northern and Southern hemisphere. It was introduced to Europe during the second half of the XIX century spreading throughout the continental and Mediterranean regions on susceptible *V. vinifera* cultivars. The genetic resistance often displayed by American grape species, of either *Muscadinia* or *Vitis* genera,⁶⁻¹⁰ supports the hypothesis of their co-evolution with *E. necator* populations. In *M. rotundifolia* major PM-resistant loci were mapped on

both chromosome 12 (Run1)⁷ and 18 (Run2.1 and Run2.2).⁶ Despite the presumed American origin of the disease, resistance to PM has also been found in accessions of the Chinese grape species V. romanetii,^{6,11} V. piasezkii (M. A. Walker and S. Riaz, personal communication), and V. pseudoreticulata.12-14 Resistance to PM was also identified in Central Asian accessions of V. vinifera. A dominant PM resistance locus (Ren1) was mapped on chromosome 13 of the V. vinifera spp. sativa accessions 'Kishmish vatkana' and 'Karadzhandal' (syn.: 'Dzhandzhal kara').^{15,16} In 'Kishmish vatkana' Ren1 resistnce was shown to restrict hyphal growth and conidiation after successful penetration of epidermal cells, which indicates the involvement of late defense responses to E. necator.¹⁵ Further exploration of wild and cultivated V. vinifera germplasm from Central Asia identified 10 additional cultivated and wild accessions with partial resistance to PM, based on the presence of molecular markers known to be linked to Ren1 in 'Kishmish vatkana' and 'Karadzhandal'.¹⁷ The newly identified accessions were presumed to carry a Ren1-like local haplotype based on the similar sequences of one of the co-segregating markers and identical allelic profiles with markers linked to the Ren1 locus.¹⁷ The presence of PM resistance in wild V. vinifera spp. sylvestris, the progenitor of the cultivated V. vinifera spp. sativa, indicates that PM resistance was potentially present in Central Asia for longer time than it has been earlier presumed and questions the origin of E. necator in North America.¹⁷ These accessions also displayed varying levels of

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resistance to PM in field trials,¹⁷ reflecting the wider genetic basis of PM resistance. This germplasm provides a unique opportunity to profile transcriptional changes that are induced by PM infection and gain insights into the complex multilayer defense strategy that grapevines from Central Asia have evolved against *E. necator*. The wider genetic basis and different horticultural attributes of this germplasm make it unique for breeding efforts, especially to stack resistance genes with different mechanisms to obtain more durable field resistance.

The type of reactions activated when specific resistance genes are expressed have been traditionally described using histochemical approaches.¹⁸ High-throughput methods that monitor genome-wide transcriptional changes can help further characterize at the molecular level the pathways regulated by defense-related genes. Genome-wide transcriptional profiling approaches have been effectively used to characterize disease resistance processes.^{14,19–24} In this study, we applied RNA sequencing approaches (RNAseq) to identify genes whose expression correlates with PM resistance in a panel of two wild and five cultivated Central Asian V. vinifera accessions. Through comparative analyses focused on differentially expressed genes shared across all the resistant genotypes but not the susceptible V. vinifera control, we identified functions that may contribute to the Ren1-dependent resistance mechanisms as well as gained insights into the molecular bases of the varying levels of resistance among these accessions. Grapevines were inoculated under controlled conditions with a highly virulent E. necator isolate and mock-inoculated controls were included. Disease susceptibility was assessed macro- and microscopically, and by quantitative PCR. Transcriptomes were sequenced at two time points after inoculation. Results are discussed in light of core inducible gene expression and their potential association with Ren1-dependent responses. Altogether the results showed that these Central Asian V. vinifera accessions activate distinct transcriptional responses to E. necator likely contributing to the partial resistance to powdery mildew.

MATERIALS AND METHODS

Plant material and assessment of PM susceptibility

Geographical origin, germplasm repository, and accession IDs of the grape genotypes used in this study are listed in Table 1. 'Khalchili', 'Husseine', and O34-16 were collected by Dr Harold P. Olmo in the 1950s, while 'Sochal' cuttings were imported into the USA in 1971 from the N. I. Vavilov Institute of Plant Industry in Saint Petersburg, Russia. 'Late Vavilov', a first-degree relative of 'Karadzhandal', is a *V. vinifera* spp. *sativa* variety of unclear origin with limited records in the *Vitis* International Variety Catalog (http://www.vivc.de) and the European *Vitis* database (http://www.eu-vitis.de). DVIT3351.27 was collected by Dr Ed Stover in Armenia. The French *V. vinifera* cv. 'Carignan' was included as a fully PM-susceptible positive control. PM disease evaluations were carried out using a detached leaf assay as described in Jones *et al.*⁵ The third and fourth fully expanded leaves were collected from multiple shoots of disease-free potted vines grown in a greenhouse. Leaves were

 Table 1. List of the seven Central Asian accessions with partial PM resistance analyzed in the study

Accession ID	Repository	Accession name	Country of origin/source collection	Species Davis/Vassal
DVIT1126	Davis	Sochal	USSR	V. vinifera spp. sativa
DVIT0576	Davis	Husseine	Afghanistan	V. vinifera spp. sativa
DVIT2323	Davis	Karadzhandal	Uzbekistan	V. vinifera spp. sativa
ARM Q01-16	Davis	Late Vavilov	Turkmenistan	V. vinifera spp. sativa
DVIT0431	Davis	Khalchili	Afghanistan	V. vinifera spp. sativa
DVIT1803	Davis	034-16	Iran	V. vinifera spp. sylvestris
DVIT3351.27	Davis	DVIT3351.27	Armenia	V. vinifera spp. sylvestris

surface-sterilized in 0.3% sodium hypochlorite solution. PM inoculations were carried out with a settling tower as described in Reifschneider and Boiteux.²⁵ A settling tower ($50 \times 50 \times 120$ cm) attached to a vacuum system was used with 5 minutes of vacuum and 10 minutes of conidia settling time for all inoculations. Conidia of two week-old *E. necator* C-strain⁵ were used as PM inoculum (mean inoculum: $\sim 2.18 \pm 1.5$ conidia/mm²). PM growth was assessed by two approaches: (i) visual scoring of infection rate under a microscope and (ii) measurement of E. necator accumulation by quantitative PCR (qPCR) at four time points (1, 5, 10, and 14 days after inoculation, dpi; for details see below). Four biological replicates were used for each time point and the whole experiment was repeated three times. Visual assessment of disease severity was carried out by two people independently using a 1-5 scale: 1 = no hypha; 2 = five to ten germinated conidia per leaf with only primary hyphae; 3 = several germinated conidia with primary and, in some cases, secondary hyphae; 4 = mycelium is visible on the leaf surface with few conidiophores; 5 = mycelial development is severe with extensive conidiation clearly visible with the naked eye. For better visual observation, staining with Coomassie Brilliant Blue R-250 was carried out on detached leaves using the procedure described in Riaz et al.¹⁷

Erysiphe necator-infected material for RNAseq

Six plants of each accession were propagated from green cuttings and established in a greenhouse. Mock and PM inoculations were performed in two separate Conviron PGR15 growth chambers (UC Davis Controlled Environment Facility). For each accession three plants were mock-inoculated and three plants were PM-inoculated as described below. The two growth chambers were maintained at identical environmental conditions, which were set to favor *E. necator* infections at 60% humidity, 23℃ during the day (16 hours), 15°C during the night. Pure E. necator isolate C-strain conidia were collected from detached leaf cultures, suspended in 0.001% Tween 20 solution and adjusted to a concentration of 5×10^{5} conidia mL⁻ Conidia were applied to the leaves using a portable paint sprayer (Perval). At the same time, grapevines in the other chamber were mock-inoculated with a 0.001% Tween solution. Leaves from each plant were collected at two time points (1 day and 5 dpi) at the same time of the day and immediately frozen in liquid nitrogen. Two PM- or mock-inoculated leaves from an individual plant were pooled and constituted a biological replicate. A total of three biological replications were obtained for each treatment. RNA was extracted using a Cetyltrimethyl Ammonium Bromide (CTAB) extraction protocol described in Blanco-Ulate et al.²⁶ Two micrograms of total RNA were enriched for polyadenylated mRNA and used to prepare sequencing libraries following the Illumina TruSeg RNA Sample Preparation Kit v2. For guality control of size and purity, libraries were visualized on an Agilent Technologies 2100 Bioanalyzer using an Agilent High Sensitivity DNA chip.

RNAseq and read processing

cDNA libraries were sequenced in single-end mode with 50 cycles using an Illumina HiSeq2500 sequencer (DNA Technology core, UC Davis). A total of eight lanes were sequenced. Raw reads were deposited to the National Center for Biotechnology Information's Gene Expression Omnibus (GEO) and are accessible through GEO (GSE67191 accession; http://www.ncbi. nlm.nih.gov/geo/guery/acc.cgi?acc=GSE67191). Sickle (v.1.2.1; https:// github.com/ucdavis-bioinformatics/sickle) with a threshold of Q>20 and Scythe (v.0.991; https://github.com/vsbuffalo/scythe) with a prior of 0.4 were used to trim adapters and quality filter the reads, respectively. Reads were mapped onto a combined V. vinifera cv. 'PN40024' (version V1 from http://genomes.cribi.unipd.it/grape/) and E. necator C-strain⁵ reference using Bowtie2 v.2.2.3²⁷ with parameters: -q -end-to-end -sensitive -no-unal -p 20. Ambiguously mapped reads were excluded from further analysis using the program sam2counts.py (v0.9.1; https://github.com/vsbuffalo/ sam2counts). Details on results of data trimming and mapping are reported in Supplementary Dataset S1.

Assessment of genetic diversity

The STAR²⁸ 2-pass mapping protocol was implemented for variant calling, because it was shown to improve alignment accuracy as well as sensitivity compared to other RNAseq mapping tools.²⁹ PCR and optical duplicates were removed with Picard tools (v.1.119 http://broadinstitute.github.io/ picard/). GATK (v.3.3.0) HaplotypeCaller was used to call sequence variants with parameters: -ploidy 2 -stand_call_conf 20.0 -stand_emit_conf 20.0 -dontUseSoftClippedBases. Homozygous SNPs were incorporated into synthetic transcripts for each accession using the GATK FastaAlternate-ReferenceMaker. The phylogenetic analysis was performed using the

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Hamming Distance implemented in the phyclust R package 30 (v.0.1–15) based on the multiple alignment of all concatenated synthetic transcripts. PAML's Yn00 (v.4.8) was implemented on reconstructed and original 'PN40024' transcripts to calculate ω (Supplementary Dataset S2). SnpEff³¹ (v.4.1a) was used along with V. vinifera gene annotations to call nonsynonymous and synonymous substitutions. Unmapped reads were assembled using Trinity (v.2.0.6) with default parameters.³² TransDecoder (v.2.0.1; https://transdecoder.github.io) was used to extract the longest open reading frames from the de novo assembled transcripts. Predicted peptides matching known transposable elements associated proteins (RepBase³³) were removed. ESTs were functionally annotated using Blast2GO.³

Calculation of differential expression

Read count normalization and significant differential expression were computed using DESeq2 v.2.1.2.10. 35 Genes were considered constitutively down-regulated in the PM-partially resistant accessions if all seven varieties measured fold-changes (log₂FC) \leq -0.5 (P \leq 0.05) relative to 'Carignan' at both 1 and 5 dpi, and considered constitutively over-expressed in the PMpartially resistant varieties if all seven measured $log_2FC \ge 0.5$ ($P \le 0.05$) at both 1 and 5 dpi (Supplementary Dataset S3). Log₂FC in response to PM was computed with study-wide Deseq2 normalized counts plus an added pseudocount or set to 'NA' if a gene was not detected in both conditions (Supplementary Dataset S4; normalization factors are listed in Supplementary Dataset S1, raw counts can be downloaded from GEO http://www.ncbi.nlm.nih.gov/geo/guery/acc.cgi?acc=GSE67191). Common PM-responsive genes associated with partial resistance were identified by applying a double fold-change cutoff: common up-regulated genes were genes with $log_2FC \ge 0.5$ in at least six Central Asian accessions and log_2FC < 0.01 in 'Carignan'; common down-regulated genes were genes with log₂FC \leq -0.5 in at least six Central Asian accessions and log₂FC \geq -0.01 in 'Carignan'. Multiple factor analyses (MFA) were performed in R using the FactoMineR package (http://factominer.free.fr).

Gene Ontology (GO) term enrichments were computed using the classic Fisher method implemented in the topGO R package (v.2.18).³⁶ GO term visualizations were created using the 'Reduce + Visualize Gene Ontology' (REViGO³⁷) webserver (http://revigo.irb.hr) with resulting terms of topGO computations as input. REViGO sub-graphs were formed by selecting the SimRel algorithm³⁸ and allowing for similarity values ranging from 0.7 to 0.9.

Quantitative PCR (qPCR)

Relative E. necator biomass accumulation was measured by qPCR. Grape and E. necator DNA were extracted using a modified CTAB protocol as described in Jones et al.⁵ from the same detached PM-infected leaves used for visual assessment of disease susceptibility. All DNA samples were randomized across reaction plates, and each plate had two replicates of uninfected V. vinifera and pure E. necator DNA samples as reference. E. necator elongation factor EnEF1 (KHJ34692) was amplified along with V. vinifera actin VvActin³⁹ to quantify E. necator biomass as described in Jones et al.⁵

cDNA for reverse transcription qPCR (qRT-PCR) was prepared from total RNA as described in Blanco-Ulate *et al.*⁴⁰ *VvActin*³⁹ was used as a reference gene and processed in parallel with the grape target genes under evaluation. Primer sequences designed for this study are provided in Supplementary Table S1. The specificity of the primer sets was checked by analyzing the dissociation curves at temperatures ranging from 60 to 95°C. Three to four biological replicates of the infected and healthy material per accession were used to obtain the relative gene expression data. All qPCR reactions were carried out on a StepOnePlus PCR System using SYBR Green Master Mix (Applied Biosystems) and the following conditions: 95°C for 10 min, followed by 40 cycles of 95°C for 3 s and 60°C for 30 s. The formula $2^{(REFERENCE \ CT \ - \ TARGET \ CT)}$ described in Chen and Dubcovsky⁴¹ was used to linearize the transcript levels for all genes.

RESULTS

A panel of Central Asian grape accessions with varying levels of partial resistance against powdery mildew

Two wild and five cultivated Central Asian V. vinifera accessions that display partial resistance against PM were the subject of this study (Table 1). To describe their disease phenotype, fungal growth and development of symptoms were assessed after leaf inoculation with the virulent E. necator C-strain. The fully susceptible V. vinifera cv. 'Carignan' was evaluated in parallel as a positive control. Conidia

germination and establishment of primary appressoria were detected at 1 day post-inoculation (1 dpi) on leaves of all accessions. By 5 dpi, extensive growth and branching of fungal mycelia were observed in the susceptible 'Carignan' leaves, whereas in all PM-partially resistant accessions mycelial growth was restricted (Supplementary Figure S1). At 14 dpi (Figure 1a), categorical visual scores were assigned to describe disease development (Figure 1b) and correlated strongly with gPCR measurements of E. necator biomass ($R^2 = 0.89$; P = 0.00041; Figure 1c). The greatest amount of fungal biomass and conidiophores was observed on the surface of 'Carignan' leaves (Figure 1a), in addition to widespread PM symptoms (i.e., white dusty appearance). Localized necrotic spots associated with appressoria, suggestive of a hypersensitive response and programmed cell death (PCD), were evident in the inoculated leaves of all PM-resistant accessions (Figure 1a).



Figure 1. Characterization of PM susceptibility in the eight V. vinifera cv (a) Micrographs of *E. necator* infection at 14 dpi. Bars = 0.2 mm (b) Mean visual scores of PM susceptibility in the eight cultivars. Different letters depict significant differences based on ANOVA followed by Tukey's HSD test ($P \leq 0.05$). (c) Correlation between visual scores of disease susceptibility and E. necator biomass measured by gPCR.

However, despite their overall similar partial resistance to the disease, the abundance of *E. necator* biomass and the presence of reproductive structures varied significantly across the Central Asian accessions at 14 dpi (Figure 1a). These results suggest that different mechanisms may contribute to the resistance phenotype in the different genotypes. ANOVA analysis followed by Tukey's HSD post-hoc test ($P \leq 0.05$) of both visual symptoms and biomass accumulation divided the seven Central Asian accessions into three groups (Figure 1b). Leaves of 'Late Vavilov' were the most infected among the Central Asian accessions, followed by 'Husseine', 'Sochal', and 'Khalchili'. The lowest amount of *E. necator* growth and reproduction were present in leaves from 'Karadzhandal' and DVIT3351.27. Based on biomass accumulation O34-16 had similar level of resistance to the other *V. vinifera* spp. *sativa* DVIT3351.27 (Figure 1c).

Sequencing and analysis of the transcriptomes of the seven Central Asian accessions and 'Carignan'

RNAseq was performed to characterize the transcriptomes of the seven Central Asian accessions and the PM-susceptible cultivar 'Carignan'. Sequencing libraries were prepared from leaf tissue collected at 1 and 5 dpi with E. necator C-strain,⁵ including mockinoculated controls for each genotype and for each time point. Three biological replications, each represented by an individual plant, were included for each treatment. On average, 12 073 196 \pm 1 890 923 raw reads per sample were obtained, of which 98.8 \pm 1.0% were retained after quality trimming and filtering. A total of 87.6 \pm 0.9% of the reads aligned to the combined reference of all 29 971 transcripts from V. vinifera 'PN40024'⁴² and the 6533 transcripts predicted for *E. necator* C-strain.⁵ Only a small proportion of the total reads mapped on E. necator, ranging from 756 in 'Karadzhandal' to 67 857 in 'Carignan' at 5 dpi, which reflects the limited accumulation of E. necator biomass on the resistant accessions compared to the PM-susceptible control. Across all genotypes and conditions, the expression of 27 172 grape genes was detected.

Reads that did not map on the 'PN40024' genome scaffolds were *de novo* assembled to identify protein-coding genes that are present in the sequenced transcriptomes and absent in the reference genome. A total of 1430 ESTs derived from putative protein-coding genes were assembled. On average 178.9 \pm 20.8 ESTs were obtained for each of the eight accessions, ranging from 148 in 'Carignan' to 199 and 209 in 'Khalchili' and 'Husseine', respectively. These *de novo* assembled transcripts represented functions potentially associated with disease responses including ethylene-responsive transcription factors, receptor-like kinases, and NBS-LRRs, as well as a large number of proteins associated with transposable elements. These results are in agreement with recent studies showing a remarkable structural variation between grape genomes.^{43,44}

Transcript sequence analyses confirmed the high degree of heterozygosity in the grape genome.^{45–47} Similarly to what was previously reported by Velasco *et al.*,⁴⁸ a heterozygous SNP rate of 2.30 \pm 0.10 SNPs/Kb in the protein-coding regions was observed. This confirmed that rates of exonic heterozygous SNPs within an individual grape genotype are higher than the rates of fixed exonic SNPs between accessions (1.57 \pm 0.08 SNPs/Kb). Homozygous SNP data were incorporated into reconstructed synthetic genes of each accession to enable further analysis of genetic diversity (Figure 2). Phylogenetic analysis based on multiple alignment of all reconstructed transcripts confirmed the closer genetic relatedness between first-degree relatives 'Late Vavilov' and 'Karadzhandal'¹⁷ (group I) and between the two accessions originating from Afghanistan ('Khalchili' and 'Husseine', group II). Closer relationships between the two *V. vinifera* spp. *sylvestris* genotypes (O34-16 and DVIT3351.27, group III) and the susceptible varieties 'Carignan'

Figure 2. Genetic diversity of the sequenced transcriptomes (a) Barplots showing the total number of homozygous SNPs resulting in synonymous or non-synonymous substitutions, or premature stop codons (b) Unrooted phylogenetic tree obtained from multiple alignment of synthetic transcripts reconstructed by incorporating the detected homozygous SNPs. Based on relatedness, genotypes were assigned to four groups.

and 'PN40024' (group IV) were also observed, while 'Sochal' did not cluster with any other accession.

Homozygous SNPs that result in non-synonymous amino acid changes or introduction of premature stop codons were analyzed to characterize the genetic diversity across accessions with potential functional relevance. An average of 25 418 \pm 1321 non-synonymous substitutions relative to 'PN40024' were identified in each accession, ranging from 23 145 in 'Carignan' up to 27 893 in O34-16. This corresponded to 0.92 \pm 0.05 non-synonymous substitutions per polymorphic gene (Figure 2a; Supplementary Dataset S2). An average of 105 \pm 6 genes for each genotype carried SNPs that resulted in premature stop codons. These genes were further analyzed as they may represent potential functions involved in resistance or susceptibility to PM. Enrichment analysis of gene ontology (GO) terms (P < 0.05) revealed that PCD and defense responses are over-represented functions in genes with premature stop codons (Supplementary Dataset S2). Four genes with premature stops were identified in all seven resistant varieties, but not 'Carignan', these included: (i) a lysine histidine transporter 2 (VIT_01s0010g02640), (ii) a ribosomal protein L13 (VIT_14s0171 g00250), (iii) a membrane bound O-acyltransferase (MBOAT; VIT_00s0507q00010), and (iv) a LRR receptor-like serine/threonineprotein kinase (VIT_00s0370g00010). The suppression of a lysine histidine transporter has been shown to confer broad-spectrum disease resistance in Arabidopsis.^{49,50}

Rates of synonymous and non-synonymous substitutions (ω values or dN/dS ratios) were calculated by pairwise comparisons of the synthetic genes of each accession against the 'PN40024' reference genome. The analysis focused on the identification of genes with $\omega > 1$, which indicates positive selection favoring amino acid replacements. In total 1971 (average per accession: 490.5 \pm 35.8) genes had $\omega > 1$ in the pairwise comparisons. These genes showed significant over-representation of 57 GO terms (P < 0.05), which included functions related to apoptotic processes and defense responses against pathogens (Figure 3; Supplementary Dataset S2). These results are in agreement with previous studies that reported elevated rates of non-synonymous over synonymous substitutions in genes associated with defense responses.^{51–57}

Identification of common constitutive transcriptional differences between PM-susceptible and PM-partially resistant grape accessions

Differences in constitutive expression of defense-related genes have been implicated in PM resistance of V. aestivalis 'Norton'.^{22,58} Common functions constitutively differentially regulated in all Central Asian accessions compared to 'Carignan' could also potentially contribute to the partial resistance displayed by these varieties, although it cannot be ruled out that functions appear to be conserved because of closer genetic relatedness and geographical origins of the PM-tolerant accessions. To identify genes that are constitutively differentially expressed between all Central Asian accessions and the PM-susceptible 'Carignan', we compared gene expression between mock-inoculated 'Carignan' leaves and mock-inoculated leaves from each of the seven PMpartially resistant accessions. Forty-nine genes were consistently more expressed (log₂FC \ge 0.5, P \le 0.05) in the PM-partially resistant accessions when compared to 'Carignan', including a putative cinnamyl alcohol dehydrogenase (VIT_13s0047q00770) located between the closest flanking markers of the *Ren1*-locus.¹⁶ Sixtythree genes showed significantly higher expression levels in 'Carignan' when compared to the Central Asian accessions, including the lysine histidine transporter 2 (VIT_01s0010g02640) previously identified in this study to have a premature stop codon in all PM-partially resistant accessions (Supplementary Dataset S3). In Figure 3, we highlight the remarkable overlap between functions enriched in the set of genes constitutively differentially expressed, both up-regulated and down-regulated, and in the set of genes under positive selection ($\omega > 1$). Worth noting is the shared group of GO terms associated with immune responses and cell death, which suggest that biotic stresses constitute an important component of the selection pressure exerted on grape populations.

A set of genes that represented constitutive differences among the PM-partially resistant accessions and 'Carignan' were validated by qRT-PCR using healthy leaves from a completely new set of plants grown under different environmental conditions (Supplementary Figure S2). The genes selected for validation belong to enriched biological functions that may be associated with either resistance or susceptibility to PM (e.g., plant immunity, cell death, hormone metabolism; Figure 3, Supplementary Table S1). The expressions of two genes encoding a receptor serine/ threonine kinase (VIT_00s0425g00030) and a lipoxygenase (VIT_ 06s0004q01480) were validated to be constitutively higher in 'Carignan' than in the Central Asian accessions. The former gene may be involved in signaling cascades during pathogen recognition, while the latter is a key biosynthetic gene for the production of jasmonic acid, a hormone involved in defense responses against necrotrophs but not biotrophs.⁵⁹ Among the genes with higher expression in the PM-resistant accessions, a multidrug and toxic compound extrusion gene (MATE; VIT_00s0225g00080) and a

Figure 3. GO term enrichment overlap between genes under positive selection ($\omega > 1$), genes with higher constitutive expression in the Central Asian accessions, and genes with higher constitutive expression in 'Carignan' (a) Venn diagram showing numbers of overlapping and specific GO terms in each of the three groups of genes. (b) Graphical representation of relationships between enriched GO terms. To highlight closely related enriched GO terms, terms were organized in undirected sub-graphs using the REViGO web server. Colors indicate the gene group in which the GO terms are enriched, consistent with panel A. Dashed boxes indicate similar biological functions among the GO terms. Supplementary Dataset S3 provides all the GO terms and numeric IDs that are not described in panel C. (c) GO Categories with the greatest number of gene members are listed for each gene group, with the color coding of column 1 consistent with the gene groups shown in panel (a). Column 1 identifiers correspond to the circles in panel (b).

indole-3-butyric acid response 10 gene (IBR10; *VIT_05s0049 g00160*) were validated to have higher expression levels in the PM-resistant accessions compared to 'Carignan'. Both genes could play a role in PM resistance: the MATE transporter may function in the transport of antimicrobial compounds across the membrane, whereas the IBR10 may be part of the auxin signaling and responses to biotic stress. The BCL-2-associated athanogene 5 (*VIT_01s0146g00150*), which is involved in regulation of cell death, was confirmed to have a higher constitutive expression only in DVIT3351.27.

Figure 4. Transcriptional responses to PM infection in the Central Asian accessions Barplots indicating the number of differentially regulated genes (P < 0.05) at 1 (a) and 5 (b) dpi. Circos⁻ plots showing common differentially expressed genes between at least 6 resistant accessions at 1 (c) and 5 (d) dpi. Red and blue lines represent common up- and down-regulated genes, respectively. External bands correspond to each of the 19 chromosomes (+ Chr00) where the genes are located. A full list of genes represented by the connections in (c) and (d) are listed in Table 2. (e) Enriched GO terms (P < 0.05) within the set of resistant-specific genes listed in Table 2. Darker colored circles represent terms with lower *P* values. Organization of sub-graphs is determined by REViGO web server.³⁷ Boxes around terms group

Identification of common transcriptional responses in the Central Asian accessions

To characterize transcriptional responses to *E. necator*, differentially expressed genes were identified by comparing mock-inoculated and PM-infected leaves from each accession. A union of 12 818 genes was differentially expressed in response to *E. necator* across all eight genotypes (P < 0.05). On average 776.1 \pm 358.7 and 1541.8 \pm 633.4 genes were significantly up-regulated in the seven resistant accessions at 1 and 5 dpi, respectively. *E. necator* also caused the down-regulation of 645 \pm 344.7 genes at 1 dpi and 956.4 \pm 535.2 at 5 dpi. A similar number of PM-responsive genes was detected in 'Carignan' at both time points. The largest number of PM-responsive genes at both time points was found in 'Karadzhandal', while 'Late Vavilov' showed the smallest number of differentially regulated genes in response to PM (Figure 4a and 4b).

Differentially expressed PM-responsive genes in all accessions were compared to identify core transcriptional responses associated with partial PM resistance and potentially part of a Ren1dependent resistance. In total, we found 51 genes differentially regulated in response to E. necator in at least six of the seven Central Asian accessions and that followed opposite trends or were not differentially regulated in the PM-susceptible 'Carignan' (Table 2). At 1 dpi, 13 genes were consistently up-regulated in the resistant accessions, while no other gene was found to be consistently down-regulated with the defined fold-change cutoffs (Figure 4c; Table 2). The 13 common differentially expressed genes at 1 dpi comprised an interesting set of inducible defense functions, including a pathogenesis related protein 1 precursor (PRP1; VIT_03s0088g00890), an ethylene-responsive transcription factor (ERF105; VIT_16s0013q00990), and five receptor kinases (VIT_00s2659q00010, VIT_04s0008q00310, VIT_09s0002q03020, VIT_16s0148g00030, VIT_19s0014g04130). At 5 dpi, only six genes were up-regulated in the PM-partially resistant accessions (Table 2), including two putative receptor serine/threonine-protein kinases (VIT_00s0258q00010, VIT_00s0294q00060) and a putative CC-NB-LRR (VIT_05s0102q01010). Notably, late common PM responses (5 dpi) in the Central Asian accessions involved a larger number of down-regulated genes (Table 2; Figure 4d). These 32 genes represent significant enrichment in nucleotide binding-related functions and protein kinase activities (P < 0.05; Figure 4e).

Chromosome 18 had the greatest number of differentially expressed genes in the PM-partially resistant varieties. Multiple PM resistance loci including *Ren4* in *V. romanetii, Run2.1*, and *Run2.2* in *M. rotundifolia*⁶ as well as 55% of the annotated NB-LRR genes are located on this chromosome.⁶⁰ A positional gene enrichment analysis (PGE⁶¹) of chromosome 18 detected a significant over-representation of differentially regulated genes in response to PM between coordinates 3 401 893 to 8 421 561 (Figure 5), a region encompassing 496 protein-coding genes. Interestingly, the same region of chromosome 18 was enriched for genes undergoing positive selection (Figure 5d). Expression of the seven PM-responsive genes located in this region was confirmed by qRT-PCR (94.64% validation for 56 comparisons; Figure 5e).

PM-responsive genes specifically associated with the susceptible phenotype were also detected. Six genes at 1 dpi and 11 genes at 5 dpi were found to have significant differential expression only in 'Carignan'. At 1 dpi, *VIT_00s0187g00330*, encoding a protein with a IQ calmodulin-binding domain similar to the apoptosis regulator Bcl-2 protein, was up-regulated in 'Carignan' and either down-regulated or not detected in all resistant varieties. In 'Carignan', *E. necator* caused the down-regulation of a guaninemethyltransferase (*VIT_08s0040g01440*) and a PHD transcription

terms based on functional similarities, including (I) plant growth, (II) cell adhesion, (III) defense responses, (IV), cuticle formation, (V) phosphorylation, and (VI) cellular metabolism.

 Table 2.
 Common PM-responsive genes in all Central Asian accessions at 1 and 5 dpi

Gene accession	Functional annotation	Gene accession	Functional annotation			
1 DPI up-regulated genes in	n resistant varieties					
VIT_00s2659g00010	CRK10 (cysteine-rich RLK10)	VIT_15s0048g02430	Naringenin,2-oxoglutarate 3-dioxygenase			
VIT_01s0011g05090	Major latex-like protein 34	VIT_16s0013g00070	Unknown			
VIT_03s0088g00890	Pathogenesis related protein 1 precursor	VIT_16s0013g00990	Ethylene-responsive transcription factor ERF105			
VIT_04s0008g00310	Clavata1 receptor kinase (CLV1)	VIT_16s0050g01910	Unknown			
VIT_04s0008g04180	Arsenite transport protein (ArsB)	VIT_16s0148g00030	Receptor-like protein kinase LRK14			
VIT_04s0044g00680	S-receptor kinase	VIT_19s0014g04130	Serine/threonine-protein kinase receptor ARK3			
VIT_09s0002g03020	FRK1 (FLG22-induced receptor-like kinase 1)					
5 DPI up-regulated genes in resistant varieties						
VIT_00s0258g00010	Receptor serine/threonine kinase	VIT_07s0005g03140	Aspartyl protease			
VIT_00s0294g00060	Receptor serine/threonine kinase	VIT_07s0031g01390	Cyp71A1			
VIT_05s0102g01010	R protein PRF disease resistance protein	VIT_19s0014g04240	S-locus protein kinase			
5 DPI down-regulated genes in resistant varieties						
VIT_04s0008g01970	ER (ERECTA)	VIT_15s0021g02280	Matrix metalloproteinase			
VIT_04s0008g04230	ABC transporter G member 22	VIT_15s0048g00550	Abnormal floral organs			
VIT_04s0044g01950	Diacylglycerol acyltransferase	VIT_16s0022g02370	Unknown protein			
VIT_05s0020g01690	Receptor protein kinase	VIT_16s0098g01510	Histone-lysine N-methyltransferase ATXR6			
VIT_06s0004g02110	Myb domain protein 83	VIT_17s0000g09290	Protein kinase ATN1			
VIT_06s0004g07910	Ovate family protein 3 OFP3	VIT_18s0001g03610ª	Auxin-independent growth promoter			
VIT_07s0129g00340	Shoot gravitropism 7	VIT_18s0001g03670ª	Zinc finger (C2H2 type) family			
VIT_08s0056g01130	Mini zinc finger 2 MIF2	VIT_18s0001g05840ª	RNA recognition motif (RRM)-containing protein			
VIT_09s0002g06300	Unknown	VIT_18s0001g06690 ^a	Gibberellin 20 oxidase 2			
VIT_09s0002g06750	ERF/AP2 transcription factor sub B-6 SHINE	VIT_18s0001g08550ª	Squalene monooxygenase			
VIT_11s0103g00190	Phospholipase A2 alpha	VIT_18s0001g08590 ^a	No hit			
VIT_12s0028g02240	Thioredoxin TTL3	<i>VIT_18s0001g10070</i> ª	Receptor kinase			
VIT_12s0059g01830	Unknown	VIT_18s0001g14660	P-glycoprotein 13			
VIT_12s0059g02770	Shoot gravitropism 7	VIT_18s0041g02160	Lipase GDSL			
VIT_14s0066g00010	Unknown protein	VIT_19s0014g00680	RKF1 (receptor-like kinase in flowers 1)			
VIT_14s0108g01270	Cyclin-dependent kinase CDC2C	VIT_19s0015g00530	Fasciclin arabinogalactan-protein (FLA1)			

^aGenes located in the region of Chromosome 18 highlighted in Figure 5.

factor (*VIT_04s0069g00140*). At 5 dpi, 'Carignan'-specific differential regulation included the down-regulation of an NBS-LRR receptor (*VIT_07s0005g06240*) and the up-regulation of genes encoding a S-receptor kinase 1 (*VIT_11s0016g04890*) and a BTB/ POZ domain-containing protein (*VIT_18s0122g01340*).

Identification of transcriptional activities that correlate with the different levels of disease resistance

To visualize similarities in the PM responses among all eight varieties, principal coordinate analysis (PCoA) was performed with the pairwise intersections of the differentially expressed genes in response to *E. necator* (Supplementary Figure S3). Similarities in differentially expressed genes between accessions correlated more evidently with the pattern of disease susceptibility (Figure 1) than with genetic relatedness (Figure 2b). The first and second principal components of the PCoA for 5 dpi data clearly separated 'Karadzhandal', the most resistant of all Central Asian accessions from the most susceptible accessions, 'Late Vavilov', and 'Carignan' (Supplementary Figure S3b). The same pattern was evident when the PCoA was performed using enriched GO terms for each pairwise comparison between accessions (Supplementary Figure S4).

Multivariate analysis was performed to identify genes whose expression correlates with the most resistant disease phenotypes. Fold changes, along with PM visual scores and qPCR measurements of *E. necator* biomass, were used as quantitative variables in a multiple factor analysis (MFA, Figure 6a). The most resistant accessions 'Karadzhandal', O34-16, and DVIT3351.27 separated from the other Central Asian accessions along dimension 1, with 'Late Vavilov', the most susceptible genotype isolated from the rest. Similar clustering of accessions was obtained when normalized gene expression

counts were used (Supplementary Figure S5). Variables with strong correlation with the main dimension 1 were extracted ($R \ge 0.7$, P <0.01) and filtered to identify genes specifically associated with the transcriptional profiles of the three most resistant accessions. Thirty-five PM-responsive genes were discovered with similar patterns of differential regulation in 'Karadzhandal', O34-16, and DVIT3351.27 and opposite trends in 'Carignan'. We also identified 46 genes consistently more expressed in 'Karadzhandal', O34-16, and DVIT3351.27 compared to 'Carignan' (Supplementary Figure S5b). Functions related to hormone regulation, cellular transport, pectin metabolism, and xenobiotic catabolic processes were significantly over-represented in this set of 81 genes (Figure 6c). Interesting candidates included NB-LRRs (VIT_13s0139g00130, VIT_13s0158g00210, VIT_12s0034g01260, VIT_09s0002g04950), a cinnamyl alcohol dehydrogenase (VIT_00s0615g00010), and a MATE transporter (VIT_03s0038g00410) similar to EDS5, an essential component of salicylic acid signaling in Arabidopsis.⁶

DISCUSSION

Late post-penetration resistance is associated with partial resistance in the Central Asian accessions

In this study, we sequenced and analyzed the transcriptomes of seven Central Asian grape accessions that were previously shown to carry a *Ren1*-like local haplotype.¹⁷ Phylogenetic analyses using homozygous SNPs confirmed the genetic relationships reported in Riaz *et al.*¹⁷ The clustering reflected geographical origin and relatedness between modern cultivated varieties and *sylvestris* accessions. 'Karadzhandal' and 'Late Vavilov' have a first-degree parent progeny relationship with each other and were placed in the same clade. Similarly, two *V. vinifera* ssp. *sylvestris* accessions were closer to each other in comparison to cultivated *V. vinifera* spp. *sativa*

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Figure 5. Genomic region with significant enrichment in PM-responsive genes in the Central Asian accessions. (a) Heatmap showing gene density along chromosome 18. Colors range from dark blue (smaller gene density) to red (greater gene density). (b) Graphical representation of the PGE analysis results. Bars represent regions of chromosome 18 with significant enrichment in differentially expressed genes (P < 0.05). (c) Graphical representation of the location of protein-coding genes in the region identified by PGE analysis. Each box represents the exon of a protein-coding gene. (d) Locations of genes that are either detected as differentially expressed specifically in the Central Asian accessions in response to *E. necator* (blue) or constitutively more expressed in the Central Asian accessions than in 'Carignan'. Gray boxes identify genes in the same regions that are under positive selection ($\omega > 1$). (e) Correlation between PM-induced fold-changes measured by qRT-PCR and RNAseq.

accessions. We confirmed the partial resistance phenotype of these accessions, which we show is associated with a late post-penetration response to *E. necator* as previously observed in 'Kishmish vatkana'¹⁵ and 'Karadzhandal'.¹⁶ In all Central Asian accessions, *E. necator* germinated and established primary hyphae, but it failed to colonize extensively the leaf tissues. Differences between resistant and susceptible control plants became pronounced by day five, when the pathogen showed prolific production of mycelia and conidiophores on the PM-susceptible cv. 'Carignan', while it had limited growth and reproduction on resistant accessions. Necrotic spots that co-localized with appressoria of secondary hyphae suggest that late hypersensitive responses and PCD^{18,63} may be key in slowing down fungal spread in the Central Asian accessions as hypothesized in Hoffman *et al.*¹⁵

Comparative transcriptomics identifies common transcriptional activities potentially associated with *Ren1* in the seven Central Asian accessions

Combinations of inducible and constitutive defenses may underlie the observed late penetration resistance phenotype. Transcriptome profiling revealed a set of 51 PM-responsive genes shared by all Central Asian accessions, which may be the signature of a common Ren1-dependent response (listed in Table 2). Interestingly, no common down-regulation was detectable at 1 dpi, while at 5 dpi most of the genes shared by the seven accessions were down-regulated, supporting the previous observation of sustained up-regulation of a larger number of defense-related genes during compatible interactions between a susceptible host and E. necator.²² Constitutive defenses were implicated in the resistance of V. aestivalis 'Norton' against PM.^{22,64} As a starting point to characterize potential constitutive defenses with resistance against PM, we identified a set of genes that had higher constitutive expression levels in the Central Asian accessions when compared to the susceptible cultivar 'Carignan' (listed in Supplementary Dataset S3). Interesting functions among these genes included detoxification of endogenous and exogenous secondary metabolites (i.e., MATE-efflux transporters), and auxin responses. In all Central Asian accessions, we also observed the constitutive up-regulation of VIT_13s0047q00770, a gene encoding a putative cinnamyl alcohol dehydrogenase (CAD) located between the closest markers flanking the Ren1 locus in 'PN40024'.16 CAD gene expression was also reported to be constitutively higher in the PM-resistant V. aestivalis 'Norton' than in the susceptible 'Cabernet Sauvignon'.⁵⁸ CADs catalyze one of the final steps of the biosynthesis of monolignols and, thus, play a key role in tissue lignification.⁶⁵ In wheat, disruption of CAD expression compromises papilla-associated cell wall reinforcement and penetration resistance to Blumeria graminis f.sp. titrici, the causal agent of wheat PM.⁶⁶ CAD activity is also required for *Mla1* resistance in barley, implicating this enzyme also in post-penetration HR responses.67

Different levels of PM resistance exist in the Central Asian germplasm

Despite the presence in all accessions of a Ren1-like haplotype and the similar late post-penetration resistance phenotype, we observed significant variation in the levels of PM infection among the Central Asian accessions. In this study, we identified 81 genes whose constitutive levels of expression or patterns of regulation in presence of *E. necator* correlate with the higher level of resistance displayed by O34-16, DVIT3351.27, and 'Karadzhandal'. Further elucidation of the genetic bases of the different levels of resistance is only possible by direct sequence comparisons of the seven resistant haplotypes. Sequence analysis and further dissection by genetic mapping will resolve if the variation in disease susceptibility is due to different alleles of the same resistance gene resulting in different resistance specificities or to the unique combination of multiple genes. Analysis of the orthologous locus in 'PN40024' showed that the region is inherently prone to structural rearrangements and that NB-LRR genes proliferated through a combination of duplications and intragenic recombination events between paralogous genes.¹⁶ Similar genetic instability was found in the *Mla* PM

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Figure 6. Specific responses to PM among the most resistant Central Asian accessions (a) Multiple factor analysis (MFA) of the seven PM-partially resistant genotypes using three variables: \log_2 fold-changes of differentially expressed genes, PM visual scores, and *E. necator* biomass measured by qPCR (as previously reported in Figure 1). Each point represents a biological replicate for a given genotype. Ellipses define confidence areas (95%) for each genotype, while black squares represent their correspondent center of gravity. DIM, dimension. (b) Enriched GO terms (P < 0.05) in the set of genes that drive the separation of 'Karadzhandal', DVIT3351.27, and O34-16 in the MFA (R > 0.7, P < 0.01). To highlight closely related enriched GO terms, terms were organized into undirected sub-graphs using the REViGO web server.³⁷ (c) Genes correlated with the most resistant accessions (positive dimension 1) in Panel (a), which also present a contrasting expression pattern in the susceptible 'Carignan' accession.

resistance locus in barley.⁶⁸ It is, thus, reasonable to hypothesize that among the Central Asian accessions there exists genetic variation within the *Ren1*-locus, as sequence polymorphisms, copy number variants, and presence/absence polymorphisms, which may underlie the different levels of resistance observed. Alternatively, epistatic interactions with genes outside of the *Ren1*-locus may be responsible for the distinct levels of resistance in the different genetic backgrounds.

Transcriptional profiling of gene families known to be involved in PM resistance

Specific genes have been previously implicated in grapevine resistance and susceptibility to PM (reviewed in Ref. 69), these include Enhanced Disease Susceptibility 1 (EDS1), Mildew Resistance Locus O (MLOs) genes, receptor-like kinases (RLKs), mitogen-activated protein kinases (MAPKs), WRKY transcription factors, and PR proteins. Transcriptional profiles of all gene families potentially implicated in PM responses based on published studies can be found in Supplementary Dataset S5, including the list of differentially regulated genes in other genome-wide studies.^{14,22,70,71} On average 61.0 \pm 20.3% of the genes previously reported to be responsive to PM infections were found differentially expressed in our study (Supplementary Dataset S6). The incomplete overlap between transcriptional responses likely reflects not only differences in experimental conditions but also the diversity of resistance responses associated with the different Vitis genotypes. EDS1 has been shown to have high constitutive expression in PM-resistant V. aestivalis 'Norton' grapevines when compared to PM-susceptible V. vinifera 'Cabernet Sauvignon'.⁷² In our study, at 1 dpi none of the 'Carignan' EDS genes were responsive to E. necator, whereas the EDS gene VIT_17s0000g07560 was up-regulated in five of the Central Asian accessions. MLOs have been shown to contribute to host susceptibility to PM by negatively regulating defense responses.73 Seventeen MLOs are annotated in the 'PN40024'

genome and some have been hypothesized to be involved in PM susceptibility in V. vinifera based on their early transcriptional response to E. necator inoculation.^{70,74} Our results confirmed that . VIT_13s0019g04060 (VvMLO7⁷⁰) was up-regulated in most grapevine accessions of this study, with the exception of DVIT3351.27. Remarkably, VIT_06s0004g03100 (VvMLO13⁷⁰) was up-regulated at 5 dpi ($\log_2 FC = 0.93$; P = 0.001) only in the PM-susceptible 'Carignan' accession, suggesting a role of this gene in PM susceptibility. None of these specific EDS and MLO genes were differentially regulated in response to PM in the Chinese species V. pseudoreticulata,¹⁴ further indication of the complexity of the mechanisms grapevines have evolved to resist PM.

CONCLUSIONS

In this study, we characterized genes potentially associated with late post-penetration resistance phenotype displayed by seven V. vinifera accessions from Central Asia that carry a common *Ren1*-like local haplotype. As the physical map of the *Ren1* locus is resolved and reconstructed in all seven accessions, re-mapping of the RNAseq reads generated in this study will enable the profiling of candidate genes that may be responsible for the different levels of partial resistance observed. The identification of novel sources of genetic resistance among V. vinifera cultivars is particularly important from a breeding perspective. The introgression into elite cultivars from a V. vinifera background can reduce the rounds of backcrosses necessary to decrease the linkage drag, which could affect the distinctive characteristics of the cultivar that is the objective of genetic improvement. Stacking by marker-assisted selection of genes that confer partial resistance with single dominant resistance genes will help achieve more durable field resistance. Further genetic studies combined with comparative transcriptomic analyses with additional PM-resistant accessions from Asia (e.g., V. piasezkii and V. romanetii) and North America (e.g., M. rotundifolia) will define the different mechanisms underlying the resistance to PM available in the grape germplasm and guide breeding efforts to combine multiple resistance loci, while minimizing functional redundancies.

COMPETING INTERESTS

The authors declare that they have no competing interests.

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