



Allelic variation in transcription factor *PtoWRKY68* contributes to drought tolerance in *Populus*

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Abstract

Drought stress limits woody species productivity and influences tree distribution. However, dissecting the molecular mechanisms that underpin drought responses in forest trees can be challenging due to trait complexity. Here, using a panel of 300 Chinese white poplar (*Populus tomentosa*) accessions collected from different geographical climatic regions in China, we performed a genome-wide association study (GWAS) on seven drought-related traits and identified *PtoWRKY68* as a candidate gene involved in the response to drought stress. A 12-bp insertion and/or deletion and three nonsynonymous variants in the *PtoWRKY68* coding sequence categorized natural populations of *P. tomentosa* into two haplotype groups, *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2}. The allelic variation in these two *PtoWRKY68* haplotypes conferred differential transcriptional regulatory activities and binding to the promoters of downstream abscisic acid (ABA) efflux and signaling genes. Overexpression of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} in *Arabidopsis* (*Arabidopsis thaliana*) ameliorated the drought tolerance of two transgenic lines and increased ABA content by 42.7% and 14.3% compared to wild-type plants, respectively. Notably, *PtoWRKY68*^{hap1} (associated with drought tolerance) is ubiquitous in accessions in water-deficient environments, whereas the drought-sensitive allele *PtoWRKY68*^{hap2} is widely distributed in well-watered regions, consistent with the trends in local precipitation, suggesting that these alleles correspond to geographical adaptation in *Populus*. Moreover, quantitative trait loci analysis and an electrophoretic mobility shift assay showed that SHORT VEGETATIVE PHASE (*PtoSVP.3*) positively regulates the expression of *PtoWRKY68* under drought stress. We propose a drought tolerance regulatory module in which *PtoWRKY68* modulates ABA signaling and accumulation, providing insight into the genetic basis of drought tolerance in trees. Our findings will facilitate molecular breeding to improve the drought tolerance of forest trees.

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Introduction

Drought stress is one of the most common abiotic stress factors affecting forest tree growth and productivity (Ragauskas et al. 2006). Plant stem hydraulic conductance and above-ground biomass production decrease substantially under drought stress, resulting in up to 45% reduction in radial growth of many forest trees (Barber et al. 2000). To reduce the adverse effects of drought stress on plant growth and development, plants have evolved multifaceted strategies involving morphological, physiological, and biochemical adaptations (Shinozaki et al. 2003; Bohnert et al. 2006; Mukarram et al. 2021; Zhang et al. 2022). These strategies aim to alleviate or mitigate dehydration stress by increasing water uptake or reducing water loss, to protect plant cells from damage when water becomes scarce and tissue dehydration occurs (Verslues et al. 2006; Yu et al. 2013). Forest trees, in general, are often challenged by mild or moderate drought stress, which requires trees to respond physiologically by reducing the rates of transpiration and photosynthesis to abrogate the acute desiccation that leads to death. Hence, investigation of the mechanisms underpinning the physiological and photosynthetic changes in trees under drought stress could enhance drought tolerance in trees and maintain their growth and productivity (McDowell 2011).

The plant hormone abscisic acid (ABA) is a key factor regulating the plant response to drought or water insufficiency, which mediates stomatal closure and maintains water status (Raghavendra et al. 2010; Wang et al. 2021; Yu et al. 2021). The de novo biosynthesis of ABA is induced by drought stress, and genes involved in this process have been identified. For instance, 9-CIS-EPOXYCAROTENOID DIOXYGENASE 3 (AtNCED3) contributes to drought tolerance by increasing ABA accumulation in *Arabidopsis* (*Arabidopsis thaliana*) (Tan et al. 2003). In addition to ABA biosynthesis, catabolism and transport also modulate the accumulation of ABA (Chen et al. 2020). For example, the flowering repressor *SVP*, a central regulator of ABA catabolism, increases the cellular level of active ABA to respond to drought stress via decreased ABA hydroxylation via repression of *CYP707A1/3* and increased ABA-GE hydrolyzation via activation of *AtBG1* expression in leaves (Wang et al. 2018). A DTX/MULTIDRUG AND TOXIC COMPOUND EXTRUSION (MATE) family member, *AtDTX50*, negatively regulates drought tolerance by modulating ABA efflux, and a *dtx50* mutant showed increased ABA accumulation and accelerated ABA-induced stomatal closure (Zhang et al. 2014). ABA-dependent transcription networks are important in the response to drought stress. In the ABA signaling pathway, PYRABACTIN RESISTANCE1 (PYR1)/PYR1-LIKE (PYL)/REGULATORY COMPONENTS OF ABA RECEPTORS (RCAR) proteins as ABA receptors can interact with PROTEIN PHOSPHATASE 2C (PP2C) family members and repress PP2C activity (Ma et al. 2009). The result is an accumulation of active SUCROSE NONFERMENTING 1-RELATED PROTEIN KINASE 2 (SnRK2), which mediates the direct phosphorylation of the ABA INSENSITIVES (ABIS)

and ABA-RESPONSE ELEMENT BINDING FACTOR (ABF) transcription factors (TFs) (Wasilewska et al. 2008).

As plant-specific TFs, the WRKY family contains the conserved sequence motif WRKYGQK, which binds to the W-box [(T)TGACC/T] in target gene promoters (Eulgem and Somssich 2007). WRKY TFs play a crucial role in the ABA signaling cascade that underlies the plant response to stress (Rushton et al. 2012; Jiang et al. 2021; Lim et al. 2022). In *Arabidopsis*, *AtWRKY46/54/70* negatively modulates drought tolerance by globally repressing drought-inducible gene expression (Chen et al. 2017; Chen and Yin 2017). Jiang et al. (2021) found that *PalWRKY77* acts as a repressor of ABA signaling to negatively regulate the salt stress response in poplar (*Populus alba* var. *pyramidalis*) by directly binding to the W-boxes in the promoters of NO APICAL MERISTEM, ARABIDOPSIS TRANSCRIPTION ACTIVATION FACTOR AND CUP-SHAPED COTYLEDON 2 (*PalNAC002*), and RESPONSIVE TO DESICCATION 26 (*PalRD26*) to inhibit their expression. However, the ABA-dependent drought-responsive pathway in perennial woody plants is complex and unclear. Understanding the mechanisms that underpin trees to cope with drought stress is needed to enhance ecologic and economic value in the context of climate change.

Genetic variation in traits of interest under natural selection, which exist in wild relatives or progenitor species of crop plants, provides vital resources in plant breeding for desirable and complex traits (Han et al. 2018). A genome-wide association study (GWAS) identified several quantitative trait loci (QTLs) and genomic regions harboring single nucleotide polymorphisms/insertion-deletions (SNPs/indels) associated with complex traits. For example, a natural variant of *ZmNAC111* was identified in significant association with drought tolerance in maize (*Zea mays*) seedlings by using GWAS, which governs water-use efficiency under drought stress (Mao et al. 2015). The regulatory hierarchy of complex traits often involves clusters of a few related genes. Although GWAS can provide statistical links from genotypes to phenotypes, it typically cannot uncover functional pathways that encompass multiple related genes (Wang et al. 2010). Omics analyses (e.g. transcriptomics) can bridge the gap between gene and function through genetic regulatory networks which enhances the effectiveness of the GWAS approach (Tang et al. 2021). For example, co-expression networks can be used to infer the functions of genes based on their associations with their network neighbors and integrate transcriptome data to analyze genes that regulate complex traits. Transcriptome analysis, coupled with co-expression network and expression quantitative trait loci (eQTL) mapping, facilitates the integration of potential regulatory networks of complex traits (Langfelder et al. 2011; Majewski and Pastinen 2011; Cubillos et al. 2012; Krouk et al. 2013). The application of these methods singly or in combination provides insight into the underlying genetic regulatory networks for desirable traits in plants (Civelek and Lusic 2014). For instance, the genetic architecture of leaf shape variation and candidate genes associated with

leaf development was characterized by GWAS, then co-expression network analysis has been used to prioritize the centrality of GWAS-identified genes, and integrated eQTL enabled the functional characterization of a set of candidate genes in poplar (*P. tremula*) (Mahler et al. 2020). Tong et al (2022) revealed the transcriptional regulation network of salt-inducible gene *PtoRD26* in response to salt stress using co-expression analysis in Chinese white poplar (*P. tomentosa* Carr. clone 741). Therefore, systematic integration of GWAS, co-expression, and eQTL approaches may facilitate the dissection and rewiring of the gene regulatory hierarchy of complex traits. In this regard, exploiting the causative alleles of complex traits by systems genetics in natural populations provide a rich source of a target for breeding beneficial traits.

Here, we compared drought-related traits of a natural population of *P. tomentosa* under well-watered and drought conditions and performed a GWAS of the changes in these drought-related traits during drought to mining the candidate genes that were associated with drought tolerance. The most significant locus contains a gene annotated for *PtoWRKY68*, which featured a 12 bp indel and three nonsynonymous variants in the coding region. These affected its transcriptional regulatory activity and binding to the promoters of the downstream genes *PtoABF2.1*, *PtoRD26.1*, and *PtoDTX49.1*, thereby affecting drought tolerance. Moreover, eQTL mapping identified the MADS-box transcription factor *PtoSVP.3* as an upstream regulator of *PtoWRKY68* in response to drought stress. Herein we report the identification of a *PtoSVP.3*-*PtoWRKY68*-*PtoABF2.1*/*PtoRD26.1*/*PtoDTX49.1* module that regulates ABA signaling and accumulation to cope with drought stress in *Populus*.

Results

GWAS for drought tolerance in *Populus tomentosa*

To dissect the genetic architecture of phenotypic variation in drought tolerance, we phenotyped four photosynthetic and three physiological traits in a natural population of *P. tomentosa* comprising 300 accessions of 1-yr-old trees. Compared to those under well-watered conditions, plants under drought conditions exhibited significantly increased ($P < 0.001$, *t*-test) water-use efficiency (WUE; 32.90%), ABA levels (28.41%), and proline level (PRO; 28.46%), and decreased stomatal conductance (G_s ; 36.41%), intercellular CO_2 concentration (C_i ; 27.39%), transpiration rate (Tr ; 62.21%), and chlorophyll content (Chl; 13.49%) (Fig. 1). Significant phenotypic variation was identified in these drought-related traits among three climate regions (Supplemental Fig. S1). Accessions from the northwestern (NW) or northeastern (NE) climate regions of China had higher rates of change in these drought-related traits relative to those from the southern (S) region following drought stress (Supplemental Figs. S1 and S2). Based on their high repeatability ($h^2 > 0.75$) and variability among *Populus* individuals, the percentage reduction or increase in these seven traits during drought was used as drought tolerance indexes.

Using 3,002,432 SNPs from genome resequencing of a natural population of *P. tomentosa*, we performed GWAS to identify the genetic loci underlying drought tolerance. At the whole-genome scale, based on the population structure (Q) and kinship (K) of the population, a total number of 22 SNPs were significantly associated with the seven drought-related traits ($P < 3.3 \times 10^{-7}$; $1/n$, Bonferroni test; Fig. 1H; Supplemental Fig. S3). These SNPs were annotated into 16 candidate genes distributed on chromosomes 3, 4, and 15, and they were independent of each other based on linkage disequilibrium (LD) analysis (Supplemental Table S1). The most significant SNP, Chr4_10634808 (C/T) ($P = 5.7 \times 10^{-10}$), located 8.0 kb downstream of the termination codon of *Ptom.004G.01095* and 1.9 kb upstream of the start codon of *Ptom.004G.01096*, was significantly associated with G_s (Fig. 1H). *Ptom.004G.01095*, which harbors the Pfam domain DUF3598 (*PtoDUF3598*) is a homolog of an *Arabidopsis* gene annotated as “Biogenesis Factor Required for ATP Synthase 1” based on phylogenetic analysis (Supplemental Fig. S4A) (Zhang et al. 2018). *Ptom.004G.01096* encodes a Group I WRKY protein that has two WRKY domains and a CCHC (represent amino acid sequence, where C is cysteine, H is histidine) zinc finger motif, which homolog in *P. trichocarpa* had been designated as *PtrWRKY68*, thus we named it *PtoWRKY68* (Jiang et al. 2014). Phylogenetic analysis of Group I WRKY members indicated that *Ptom.004G.01096* is a homolog of *AtWRKY3*, which is involved in the regulation of defense response to pathogen and salt stress (Supplemental Fig. S4B) (Lai et al. 2008; Li et al. 2021). *PtoWRKY68* expression was significantly increased in leaves, in contrast to the unaffected *PtoDUF3598*, upon drought stress (Fig. 1, I and J). Therefore, *PtoWRKY68* might involve in drought responses in *P. tomentosa*.

PtoWRKY68 is a positive regulator of drought tolerance

To assess the involvement of *PtoWRKY68* in drought tolerance, we ectopically overexpressed *PtoWRKY68* in *Arabidopsis*, and two independently generated homozygous transgenic lines, OE-1 and OE-3, were selected and subjected to drought stress (Fig. 1K). The transgenic lines were significantly more tolerant to drought stress than Columbia-0 wild-type (WT) plants. Compared to WT, phenotyping showed that the rosette leaves of the two OE transgenic plants had alleviated wilting or the chlorosis phenotype upon exposure to drought stress for 10 d (Fig. 1L). In addition, photosynthetic parameters G_s (43.87%) and Tr (15.16%) were significantly decreased in OE lines compared to WT plants, the C_i (5.41%) and Chl content (10.90%) were also slightly reduced but not obviously in transgenic lines (Supplemental Fig. S5, A to D). However, WUE (26.62%), ABA (42.7%), and PRO (18.33%) in the OE plant leaves were elevated relative to the WT following drought treatment for 10 d (Supplemental Fig. S5, E to G). Therefore, *PtoWRKY68* may enhance the drought tolerance of *Arabidopsis* transgenic plants. Further, the detached leaves of OE lines showed a significantly lower rate of water loss than the WT at multiple time points (Fig. 1M), consistent with the reduction in G_s and the improvements in the phenotypic

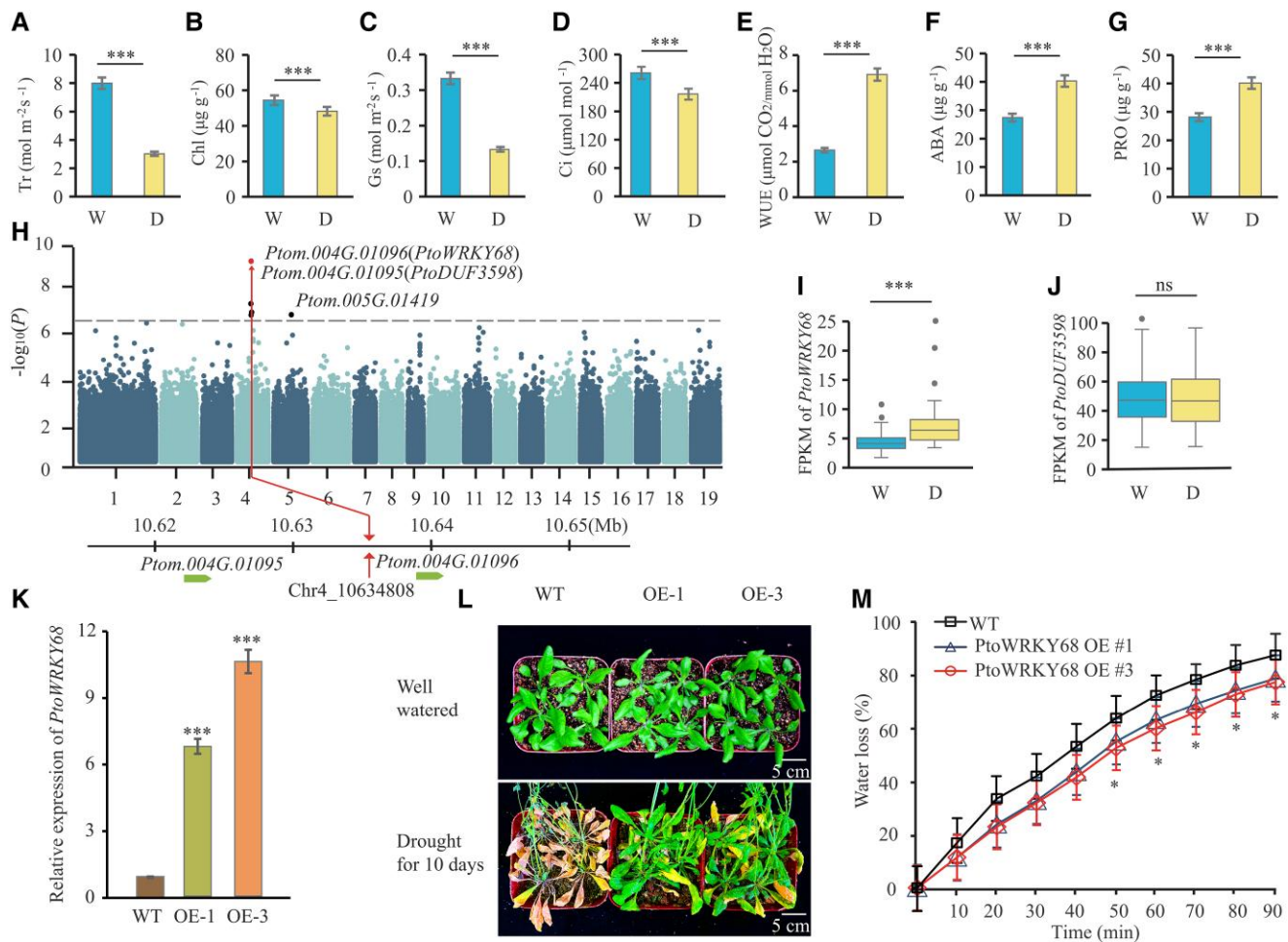


Figure 1. GWAS for drought tolerance in a *Populus* natural population. **A** to **G**) Seven drought-related traits under well-watered (W) and drought (D) conditions. Transpiration rate (**A**, Tr), chlorophyll (**B**, Chl), stomatal conductance (**C**, G_s), intercellular CO_2 concentration (**D**, C_i), water-use efficiency (**E**, WUE), **F** (ABA), and proline (**G**, PRO) under the two conditions. Each trait was measured in 300 *P. tomentosa* accessions. Error bars are \pm SD; significant differences were determined using a *t*-test, $***P < 0.001$. **H**) Manhattan plot for GWAS with the percentage increase in stomatal conductance (G_s) under well-watered and drought conditions. Red dashed horizontal line, Bonferroni-adjusted significance threshold ($P < 3.3 \times 10^{-7}$). SNPs in candidate genes, as identified by GWAS, are shown as red dots. **I** to **J**) FPKM values of two candidate genes in the *P. tomentosa* population under well-watered and drought-stress conditions. In box plots, center line represents the median, box limits denote the upper and lower quartiles, whiskers indicate the interquartile range, and dots are outliers. Significant differences were determined using a *t*-test, $***P < 0.001$. ns, no significant difference. **K**) RT-qPCR analysis of *PtoWRKY68* transcript level in two independent transgenic lines were relative to wild-type (WT) plants, 35S:*PtoWRKY68*⁻¹ (OE1) and 35S:*PtoWRKY68*⁻³ (OE3). Error bars are \pm SD from three biological replicates ($n = 3$ plants for each replicate); significant differences were determined using a *t*-test, $***P < 0.001$. **L**) Images of the drought-stress phenotypes of WT, OE-1, and OE-3 plants. Twenty-eight-day-old plants were subjected to drought stress for 10 d. Well-watered represents a 95% relative gravimetric soil water content (rSWC), and drought represents a 17% rSWC. Scale bar, 5 cm. **M**) Time course of water loss from detached leaves of 28-d-old WT, OE-1, and OE-3 transgenic plants. Water loss is shown as a percentage of the initial fresh weight. Three independent experiments were carried out, each involving three plants. Error bars are \pm SD; significant differences were determined using a *t*-test, $*P < 0.05$.

performance of the OE lines under drought treatment. Taken together, these results implicate *PtoWRKY68* in the positive regulation of drought tolerance.

Identification of drought-tolerant/sensitive alleles of *PtoWRKY68*

To determine the molecular basis of the natural variation in *PtoWRKY68* in *P. tomentosa*, a 6.8 kb genomic DNA fragment encompassing the entire coding sequence (CDS) of

PtoWRKY68 and its 2 kb upstream regulatory region was analyzed in the re-sequenced natural population of 300 *P. tomentosa* accessions. Totals of 225 SNPs and 75 indels were identified in the population and subjected to sequence variation association analysis (Supplemental Data Set 1). A 12 bp indel upstream of the WRKY domain and three nonsynonymous variants ($MAF \geq 0.05$) in the WRKY domain were significantly associated with G_s ($P < 3.3 \times 10^{-7}$; Fig. 2A). These variants were in strong LD ($r^2 > 0.8$) with the peak signal (Chr4_10634808) in the *PtoWRKY68* promoter region

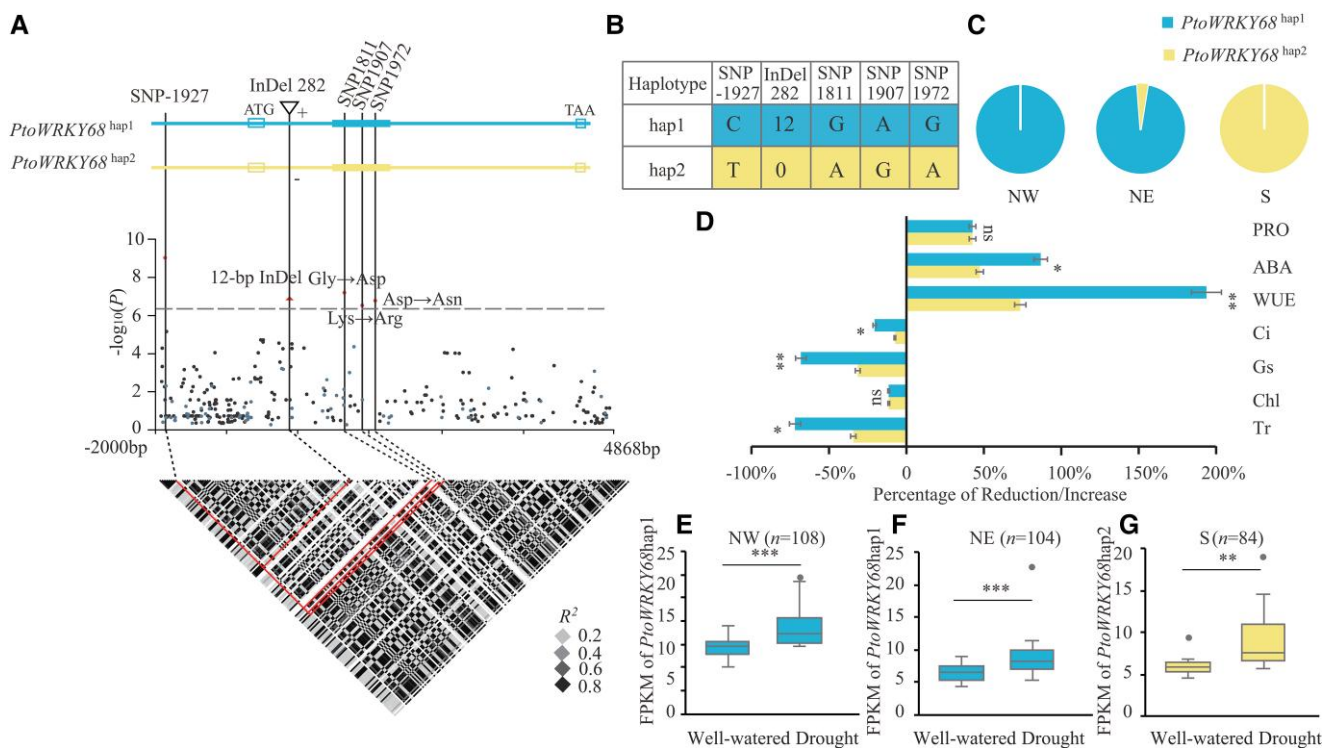


Figure 2. Natural variation in *PtoWRKY68* was significantly associated with drought tolerance in *Populus tomentosa*. **A**) Association analysis of genetic variation in *PtoWRKY68* with the percentage increase in stomatal conductance (*Gs*) and the pattern of pairwise LD of DNA polymorphisms. Black dots denote SNPs and blue dots represent insertions and/or deletions (indels). A significant SNP, three nonsynonymous variants, and a 12 bp indel are indicated by dots and a triangle above the horizontal dashed line, respectively, and are connected to the pairwise LD diagram by a dashed line (middle). Red lines (bottom) highlight the strong LD of these variations. **B**) Haplotypes of *PtoWRKY68* among *Populus* natural variations. The *PtoWRKY68* haplotype groups were categorized by these five variants. **C**) The distribution of *PtoWRKY68* haplotypes in *Populus* climate regions. NW, NE, and S represent northwest, northeast, and southern climate regions, respectively. **D**) Seven drought-related traits of the *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} alleles. Transpiration rate (*Tr*), chlorophyll (*Chl*), stomatal conductance (*Gs*), intercellular CO₂ concentration (*Ci*), water-use efficiency (*WUE*), ABA, and proline (*PRO*) were measured among 300 *Populus* genotypes under well-watered and drought-stress conditions. The percentage reduction/increase represents the change in measured traits between the two conditions. Error bars are \pm SD; significant differences were determined using the *t*-test, **P* < 0.05, ***P* < 0.01. ns, no significant difference. **E** to **G**) FPKM values of *PtoWRKY68* in NW **E**), NE **F**), and S **G**) under well-watered and drought-stress conditions. In box plots, center line represents the median, box limits denote the upper and lower quartiles, whickers indicate the interquartile range, and dots are outliers. *n* denotes the number of genotypes belonging to each haplotype group. Statistical significance was determined using the *t*-test, ***P* < 0.01, ****P* < 0.001.

(Fig. 2A). The 12 bp indel occurs in a stretch of Asn-Thr repeats; *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} have six and four Asn-Thr repeats, respectively (Supplemental Fig. S6).

The 300 accessions of *P. tomentosa* were classified into two haplotype groups, *PtoWRKY68*^{hap1} (overexpressed in *Arabidopsis* above) and *PtoWRKY68*^{hap2}, based on these five significant variants (Fig. 2B). *PtoWRKY68*^{hap1} was detected mainly in the accessions from the NE and NW regions whereas *PtoWRKY68*^{hap2} occurred mostly in the S region, as revealed by allele frequency investigation (Fig. 2C). We subsequently evaluated whether these polymorphisms of *PtoWRKY68* alter the drought tolerance of natural *P. tomentosa* varieties. The accessions with *PtoWRKY68*^{hap1} were significantly more responsive to drought than those with *PtoWRKY68*^{hap2}, in terms of changes in *WUE*, ABA, *PRO*, and photosynthetic parameters (*P* < 0.05) (Fig. 2D). *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} were significantly up-regulated by drought stress in the accessions from the three

climate regions, and the increase in the transcript level of *PtoWRKY68*^{hap1} in the NW (*n* = 108, *P* = 8.69×10^{-4}) and NE (*n* = 104, *P* = 8.65×10^{-4}) groups was comparable with *PtoWRKY68*^{hap2} in the S group (*n* = 84, *P* = 9.49×10^{-3}) (Fig. 2, E to G). These results suggested that the difference in drought responses between the two haplogroups is not due to the difference expression level of *PtoWRKY68* alleles.

To explore whether allelic variations in *PtoWRKY68* confer drought tolerance, we overexpressed *PtoWRKY68*^{hap2} in *Arabidopsis* (Supplemental Fig. S7A). In a drought stress assay, transgenic plants carrying *PtoWRKY68*^{hap2} (*PtoWRKY68*^{hap2}OE) displayed more drought tolerance than WT plants but an enhanced wilting phenotype compared to transgenic plants carrying *PtoWRKY68*^{hap1} (*PtoWRKY68*^{hap1}OE) after 10-d drought stress (Supplemental Fig. S7B). Regarding photosynthetic and physiological traits, *PtoWRKY68*^{hap1}OE plants had higher *WUE*, ABA, and *PRO* values but lower *Gs* and *Tr* values compared to WT and *PtoWRKY68*^{hap2}OE plants under drought stress

(Supplemental Fig. S7, C to I). In addition, *PtoWRKY68*^{hap2}OE plants exhibited faster water loss than *PtoWRKY68*^{hap1}OE plants under drought stress (Supplemental Fig. S7J). These results suggest that *PtoWRKY68*^{hap1} improves drought tolerance and that this improvement is associated with the allelic variation. Moreover, we identified Asn-Thr repeats and nonsynonymous variants in the *PtoWRKY68* homolog *PtrWRKY68* (*P. trichocarpa*) and *PagWRKY68* (*P. alba* × *P. glandulosa*, 84 K), with similar haplotypes to *PtoWRKY68*^{hap1} or *PtoWRKY68*^{hap2} (Supplemental Fig. S8). Therefore, the different responses to drought stress in *Populus* might be attributable to allelic variation in *PtoWRKY68*, with *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} designated as the drought-tolerant and drought-sensitive alleles, respectively.

Identification of the target genes of *PtoWRKY68* for regulation of drought tolerance

To investigate the potential gene interaction networks of *PtoWRKY68* in response to drought stress, we constructed co-expression networks for the differentially expressed genes (DEGs) between well-watered and drought-stress conditions. The well-watered and drought stress networks encompassed 17 and 23 modules (Supplemental Fig. S9, A and B), respectively, suggesting rearrangement of the co-expression network in response to drought. We analyzed the correlation between the module eigengenes with the phenotypic values of each accession. The well-watered network module 7 (wM7) and the drought-stressed module 8 (dM8), containing *PtoWRKY68*, were negatively correlated with *Gs*, *Ci*, *Tr*, and *Chl* but positively correlated with *WUE*, *ABA*, and *PRO* (Supplemental Fig. S9, A and B). To prioritize causal genes, we focused on genes in these two modules with high gene significance (absolute value >0.80) measured using drought-related traits and high module membership (absolute value >0.20) with the module eigengenes (Supplemental Fig. S9C; Supplemental Data Sets S2 and S3) (Liu et al. 2019). Gene annotation analysis of well-watered and drought-stress networks led to the identification of 131 conserved hub genes with high connectivity (Supplemental Table S2). Among these conserved hub genes, 11 overlap genes were found in wM7 and dM8 (Fig. 3A), which are involved in environmental information processing and signal transduction, such as ABC transporter, respiratory burst oxidase homolog protein, and ABA-responsive element binding factor.

To define the potential transcriptional targets of *PtoWRKY68*^{hap1} or *PtoWRKY68*^{hap2} in response to drought stress, we analyzed DEGs between the *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} groups under drought stress. In all, 164 genes were differentially expressed in two haplogroups based on a significant difference ($P < 0.05$) and an at least twofold change (absolute \log_2 fold change >1, Supplemental Data Set 4), suggesting that their expression is affected by allelic variation in *PtoWRKY68*. To identify direct targets of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2}, DNA affinity

purification sequencing (DAP-seq) was employed (Bartlett et al. 2017). A total of 58,960 and 36,899 notable peaks were identified in genomic regions of *PtoWRKY68*^{hap1} or *PtoWRKY68*^{hap2}, respectively. Among these peaks, 17% and 18% were located within the promoters (2 kb regions upstream of ATG), respectively (Supplemental Fig. S3, B and C). Using the MEME suite, the core sequence and the W-box motif of (T/G)TTGAC (C/T) (W1-box, $e\text{-value} = 5.2e^{-1181}$) and (T/G)TTGAC(C/T) (W2-box, $e\text{-value} = 9.5e^{-1103}$) were substantially enriched among the *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} binding regions, respectively (Supplemental Fig. S3, D and E). Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway enrichment analysis showed that *PtoWRKY68* target genes were primarily enriched in defense response and phytohormone signaling pathway (Fig. 3, F and G).

Based on the results of co-expression, DEG, and DAP-seq analyses, we prioritized three genes co-expressed with *PtoWRKY68*, differentially expressed in *PtoWRKY68*^{hap1} vs. *PtoWRKY68*^{hap2}, and directly bound by *PtoWRKY68* alleles (Fig. 3H). *Ptom.014G.00172* encoding a basic leucine zipper [bZIP] transcription factor, which homolog in *Arabidopsis* was *AtABF2* and thus named *PtoABF2.1* (Supplemental Fig. S10). *Ptom.011G.00876* encoded an NAC domain-containing protein (*PtoRD26.1*), which homolog in *Arabidopsis*, *AtRD26* (or else named *NAC072*), regulates ABA-dependent stress-response signaling (Supplemental Fig. S11) (Fujita et al. 2004). *Ptom.003G.00934* encoded the MATE family protein DETOXIFICATION, which was named *PtoDTX49.1* based on phylogenetic analysis (Supplemental Fig. S12). A homolog in *Arabidopsis*, *AtDTX50*, functions as an ABA efflux transporter and negatively regulates the drought response (Zhang et al. 2014). Under drought stress in *Populus*, the FPKM values of *PtoABF2.1* and *PtoRD26.1* showed significantly greater upregulation in the *PtoWRKY68*^{hap1} group than in the *PtoWRKY68*^{hap2} group under drought stress (Supplemental Fig. S3, I and J), whereas *PtoDTX49.1* expression was lower in the *PtoWRKY68*^{hap1} group than in the *PtoWRKY68*^{hap2} group ($P < 0.05$) (Fig. 3K). These data suggest *PtoWRKY68*-mediated transcriptional regulation of *PtoDTX49.1*, *PtoABF2.1*, and *PtoRD26.1* in response to drought stress.

Allelic variation in *PtoWRKY68* affects its binding affinity to downstream target genes

To investigate whether the variation in *PtoWRKY68* alleles affects its binding affinity to downstream targets, we analyzed the DAP-seq data. The binding peaks of *PtoWRKY68*^{hap1} were larger than those of *PtoWRKY68*^{hap2} (located in the same region of downstream promoters) (Fig. 4A). Next, we evaluated the interaction between *PtoWRKY68* and downstream genes using a dual-luciferase reporter assay (DLRA). Luciferase (LUC) luminescence was observed when *PtoABF2.1* and *PtoRD26.1* pro-LUC were each transformed into *Nicotiana benthamiana* leaves, and it was significantly

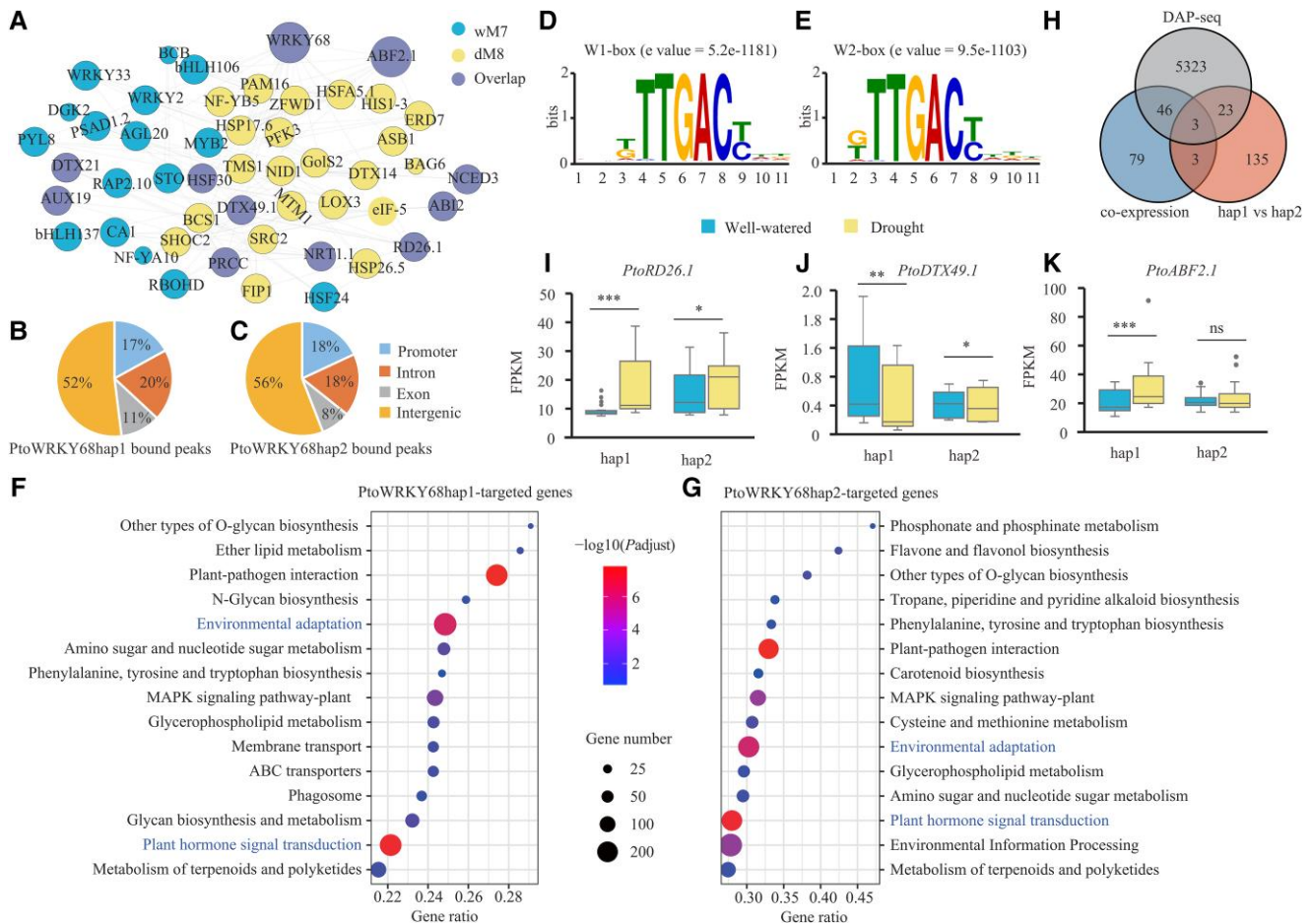


Figure 3. Identification of genome-wide direct targets of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2}. **A**) Genes identified in the well-watered network module 7 (wM7), the drought-stressed module 8 (dM8) (containing *PtoWRKY68*) and overlapping genes under two conditions (Overlap) with putative *Arabidopsis* orthologs are shown in network view. Node size indicates module membership. The larger nodes are highly connected within a module. **B** and **C**) Whole-genome distribution of bound genes by *PtoWRKY68*^{hap1} **B**) and *PtoWRKY68*^{hap2} **C**) obtained by DAP-seq with $P < 0.05$. Promoter regions were defined as the binding peaks within 2 kb upstream of ATG. **D** and **E**) Binding motifs of *PtoWRKY68*^{hap1} **D**, W1-box) and *PtoWRKY68*^{hap2} **E**, W2-box) protein by MEME-ChIP. **F** and **G**) The top KEGG-enriched terms of *PtoWRKY68*^{hap1} **F**) and *PtoWRKY68*^{hap2} **G**) bound genes by DAP-seq. P -value by Fisher's test. **H**) Venn diagram showing that three overlapping genes were considered *PtoWRKY68* alleles direct genes, were co-expressed with *PtoWRKY68*, were differentially expressed in *PtoWRKY68*^{hap1} vs. *PtoWRKY68*^{hap2}, and were directly bound by *PtoWRKY68* alleles. **I** to **K**) FPKM values of *PtoRD26.1* **I**), *PtoDTX49.1* **J**), and *PtoABF2.1* **K**) in hap1 and hap2 haplogroup under well-watered and drought-stress conditions. In box plots, center line represents the median, box limits denote the upper and lower quartiles, whiskers indicate the interquartile range, and dots are outliers. Significant differences were determined using the t -test, * $P < 0.05$, ** $P < 0.01$, *** $P < 0.001$. ns, no significant difference.

enhanced by co-transforming *PtoWRKY68*^{hap1} compared to co-transforming *PtoWRKY68*^{hap2} (Fig. 4, B and C). By contrast, the LUC activity from the *PtoDTX49.1* promoters decreased substantially when the reporter was co-transformed with *PtoWRKY68*^{hap1} compared to co-transforming *PtoWRKY68*^{hap2} (Fig. 4, B and C). Electrophoretic mobility shift assays (EMSAs) were performed to investigate the effects of allelic variation on *PtoWRKY68* binding activity. Biotin labeling showed that both *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} bound to W-box probes derived from the *PtoABF2.1*, *PtoDTX49.1*, and *PtoRD26.1* promoters, and the former generated a stronger signal (Fig. 4D), suggestive of higher affinity for target gene promoters. Taken together, these results indicate that *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} activate or repress downstream genes by

binding to their promoters and that natural variants in *PtoWRK58* are responsible for the differential binding ability of *PtoWRKY68* to the promoters of three downstream genes. Reverse transcription quantitative PCR (RT-qPCR) analysis showed that compared to WT and *PtoWRKY68*^{hap2}OE plants, the expression of *AtABF2* and *AtRD26* were significantly elevated in *PtoWRKY68*^{hap1}OE plants after drought stress (Supplemental Fig. S13, A and B), whereas the transcript level of *AtDTX50* was markedly reduced in *PtoWRKY68*^{hap1}OE plants (Supplemental Fig. S13C). The expression levels of several ABA- or drought-inducible genes—including *AtNCED3* (Iuchi et al. 2001; Tan et al. 2003), *AtRD20* (Aubert et al. 2010), *AtRD29B* (Nakashima et al. 2006), LINKER HISTONE H1–3 (*AtHIS1–3*) (Ascenzi and Gantt 1997), *AtABI2* (Ma et al. 2009), and

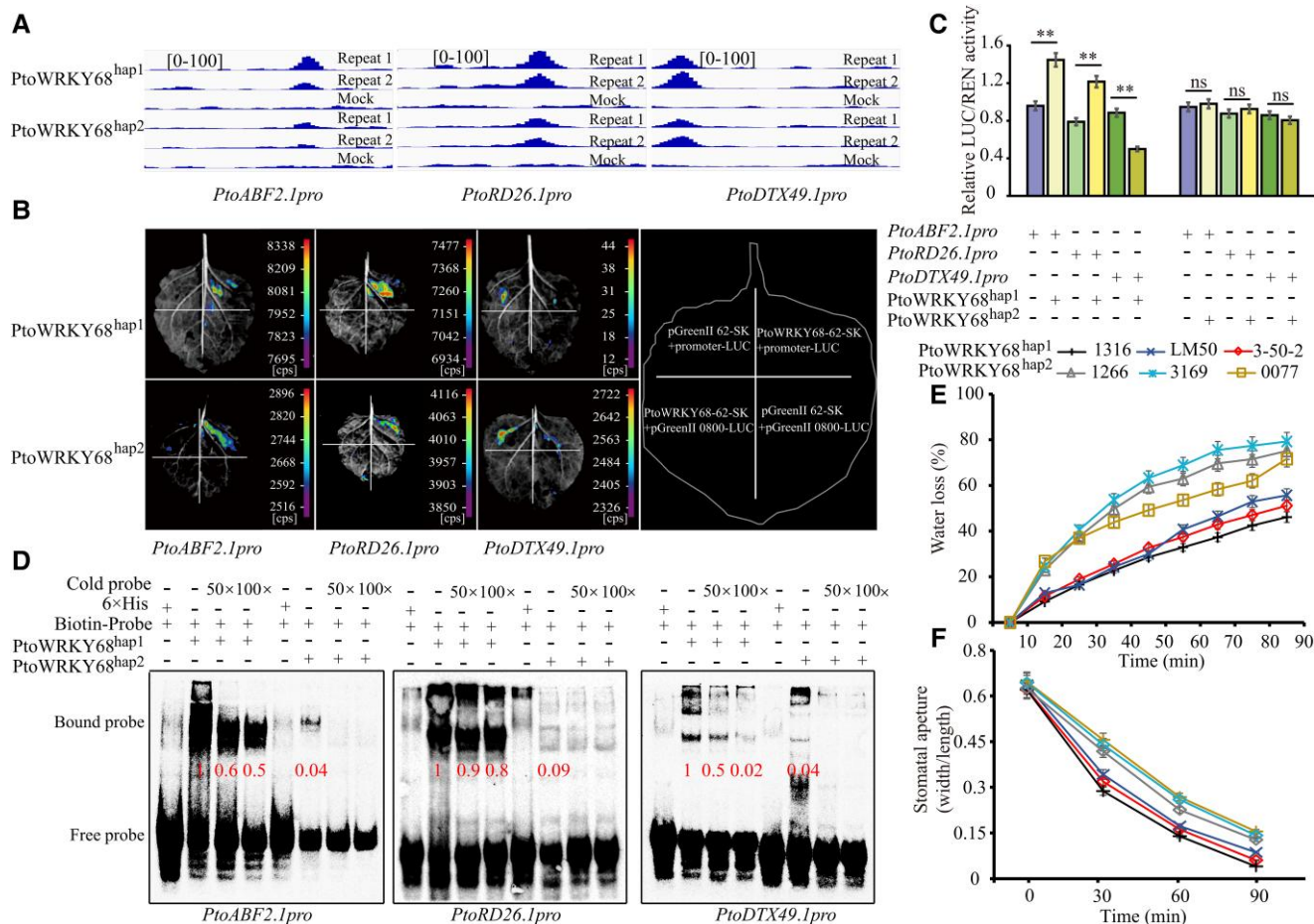


Figure 4. PtoWRKY68^{hap1} and PtoWRKY68^{hap2} directly bind the promoters of *PtoABF2.1*, *PtoRD26.1*, and *PtoDTX49.1* to activate their transcription. **A**) Binding peaks (repeats 1 and 2) and negative control (mock) of PtoWRKY68^{hap1} and PtoWRKY68^{hap2} in *PtoABF2.1*, *PtoRD26.1*, and *PtoDTX49.1* by DAP-seq. The [0 to 100] shows the scale bar for binding peak heights. **B**) DLRA of the interaction between PtoWRKY68 and the promoters of ABA-related genes. A schematic of transient co-expression of effectors and reporters is at the right; an image of luciferase activity is at the left. pGREEN 62-SK + pGREEN 0800-LUC indicates transient co-expression of empty effector (without *PtoWRKY68*) and empty reporter (without promoter); PtoWRKY68-62-SK + pGREEN 0800-LUC indicates transient co-expression of effector and empty reporter; pGREEN 62-SK + promoter-LUC indicates transient co-expression of empty effector and reporter; and promoter-LUC + PtoWRKY68 62-SK indicates co-expression of effector and reporter. **C**) Relative luciferase activity according to a DLRA assay of *N. benthamiana* leaves. Quantification was performed by normalizing firefly luciferase (LUC) activity to that of *Renilla* luciferase (REN), 35S:REN was used as the internal control. Relative luciferase activities using PtoWRKY68-pGreenII62-SK as the effector were compared to the control effector (pGreenII62-SK empty vector). Error bars are \pm SD. Statistical analysis was performed using the *t*-test ($n = 8$) and statistically significant differences are indicated by * $P < 0.05$, ** $P < 0.01$. ns, no significant difference. Three independent transfection experiments were performed. **D**) EMSA. The probe sequence was isolated from three downstream genes and consisted of a W1-box or W2-box motif. “+” and “-” indicate presence or absence of reagents in the lane during protein electrophoresis. His-labeled probe with PtoWRKY68^{hap1}/PtoWRKY68^{hap2} proteins are shown. The bound probe indicates binding affinity between the PtoWRKY68^{hap1}/PtoWRKY68^{hap2} alleles and the promoters of downstream genes. Protein concentration was 2 μ g/ μ L. Reciprocal competitive EMSA to evaluate the binding of recombinant PtoWRKY68^{hap1}/PtoWRKY68^{hap2} protein to the W-box motifs using the indicated biotin-labeled probes and unlabeled competitors. For each probe, 50 \times and 100 \times excess competitor was added. **E**) Time course of water loss from detached leaves of three 6-week-old PtoWRKY68^{hap1} *P. tomentosa* accessions (1316, LM50, and 3-50-2) and three PtoWRKY68^{hap2} *P. tomentosa* accessions (1266, 3169, and 0077). Water loss is shown as a percentage of the initial fresh weight. Three independent experiments were carried out ($n = 3$ plants for each experiment). Error bars are \pm SD. **F**) Stomatal aperture of six *P. tomentosa* accessions (as in E) in the presence of 1 μ M ABA. Epidermal strips were peeled and photographs were taken under a microscope. Three independent experiments were carried out ($n = 60$ guard cells for each experiment). Error bars are \pm SD.

AtSnRK2.6 (Zhu et al. 2020)—were enhanced in PtoWRKY68^{hap1}OE plants compared to PtoWRKY68^{hap2}OE plants and WT plants under drought conditions (Supplemental Fig. S13D). Most of these genes were co-expressed with PtoWRKY68 (Fig. 3A; Supplemental Table S2),

suggesting them to be downstream targets in the PtoWRKY68-dependent drought-responsive pathway. These up-/downregulations of ABA- or drought-inducible genes were consistent with the result that the drought tolerance of PtoWRKY68^{hap1}OE plants was significantly elevated

compared to WT and *PtoWRKY68*^{hap2}OE plants (Supplemental Fig. S13D). ABA-sensitivity assays showed that *PtoWRKY68* is involved in the ABA signaling pathway. On 1/2 mS medium without ABA, the two transgenic lines germinated without discernible morphological changes compared to WT plants in a time-course analysis (Supplemental Fig. S13, E and F). On 1/2 mS medium containing ABA (0.5 and 1 μ M), the *PtoWRKY68*^{hap1}OE and *PtoWRKY68*^{hap2}OE lines showed a lower germination rate compared to WT plants at both ABA concentrations (Supplemental Fig. S13, G and H). When 5-d-old seedlings were transferred onto 1/2 mS medium supplemented with 1 or 3 μ M ABA, *PtoWRKY68*^{hap1}OE plants displayed shorter primary roots than WT and *PtoWRKY68*^{hap2}OE plants. Moreover, stomatal aperture assays showed that stomata closed more rapidly in *PtoWRKY68*^{hap1}OE than in WT and *PtoWRKY68*^{hap2}OE under ABA treatment (Supplemental Fig. S13I), implicating *PtoWRKY68* alleles were functioned in ABA-dependent stomatal closure. These observations suggest that overexpression of *PtoWRKY68*^{hap1} substantially enhanced drought tolerance, which is mediated by amplified drought-stress signaling and an increased cellular ABA level as a result of increased ABA signaling and decreased ABA efflux in leaves.

To confirm the association between allelic variation in *PtoWRKY68* and drought tolerance in an ecological context, we selected six *Populus tomentosa* accessions: three with *PtoWRKY68*^{hap1} and three with *PtoWRKY68*^{hap2}. We measured the water loss rate and stomatal movement in response to ABA in detached leaves from these two haplogroups. As shown in Fig. 4, E and F, accessions with *PtoWRKY68*^{hap1} had a slower water loss and faster stomatal closure. Accessions with *PtoWRKY68*^{hap2} had a faster water loss and slower stomatal closure, indicating lower drought stress tolerance. Collectively, *PtoWRKY68*^{hap1} plays an important role in the modulation of ABA efflux and ABA signaling in to response drought stress.

PtoSVP.3 regulates *PtoWRKY68* response to drought stress and ABA signaling

To explore the regulatory pathway of *PtoWRKY68*, we conducted eQTL analysis using the expression of *PtoWRKY68* as a parameter to analyze the upstream regulatory hierarchy under well-watered and drought-stress conditions. Eight eQTLs were identified under well-watered conditions and 12 were identified under drought-stress conditions, which were annotated to five and seven candidate genes, respectively (Fig. 5, A and B; Table 1). Notably, Chr17_7792185 was significantly associated with *PtoWRKY68* expression under both well-watered ($P = 1.38 \times 10^{-11}$) and drought stress ($P = 1.41 \times 10^{-6}$) conditions. This SNP is in the exon region of *Ptom.017G.00699*, a MADS-box transcription factor, named *PtoSVP.3* based on phylogenetic analysis (Supplemental Fig. S14A). A homolog of the *Arabidopsis*, *AtSVP*, positively regulates ABA accumulation and ABA levels increase during the response to drought stress (Wang et al. 2018). The transcription

of *PtoSVP.3* was induced by drought stress, and its FPKM was positively correlated with that of *PtoWRKY68* (Fig. 5, C and D), suggesting that *PtoSVP.3* as a candidate for regulation of *PtoWRKY68*.

Previous study has reported that *AtSVP* positively regulates the drought response by directly binding to the CArG motif of a downstream promoter in *Arabidopsis* (Wang et al. 2018). To assess whether *PtoWRKY68* is a direct target of *PtoSVP.3*, we analyzed a 2 kb fragment of the upstream regulatory sequence of *PtoWRKY68* and identified three CArG motifs (Fig. 5E). Reciprocal competitive EMSA showed strong and specific binding of *PtoSVP.3* to the CArG motifs in the promoter regions of *PtoWRKY68* (Fig. 5F). The in vivo physical interaction between *PtoSVP.3* and these CArG motifs was analyzed by DLRA. The negative controls were recombined without the *PtoSVP.3* or *PtoWRKY68* promoter. Luciferase luminescence was observed when *PtoWRKY68* pro-LUC and *PtoSVP.3* were co-transformed into *N. benthamiana* leaves, which showed higher luminescence than the negative controls (Fig. 5, G and H). DLRA confirmed that *PtoSVP.3* activates the *PtoWRKY68* promoter in *N. benthamiana* leaves. To determine whether *SVP* regulates the expression of *PtoWRKY68* homolog *AtWRKY3* in *Arabidopsis*, we obtained the *Atsvp* T-DNA insertion mutant from the *Arabidopsis* Biological Resource Center (ABRC) (Supplemental Fig. S14, B and C), and examined its *AtWRKY3* expression. RT-qPCR analysis indicated that the expression level of *AtWRKY3* was significantly lower in *svp* mutant than WT plants (Supplemental Fig. S14D), suggesting the transcript level of *AtWRKY3* in *svp* mutant was markedly inhibited. Taken together, our results show that *PtoSVP.3* enhances the expression of *PtoWRKY68* under drought stress by binding to CArG motifs in its promoter, thereby positively regulating drought tolerance in a manner involving the ABA signaling pathway rather than ABA catabolism.

Discussion

In light of the outcomes of the system genetics strategy, we propose an ABA-dependent drought-responsive network of *PtoWRKY68* alleles that are positively regulated by *PtoSVP.3* in respond to drought stress. The allelic variation in the CDS region of *PtoWRKY68* differentially activated *PtoRD26.1* and *PtoABF2.1* and repressed *PtoDTX49.1* to confer drought tolerance by modulating ABA signaling and accumulation in *Populus* (Fig. 6).

The *PtoSVP.3*-*PtoWRKY68*-*PtoDTX49.1*/*PtoABF2.1*/*PtoRD26.1* cascade forms a drought-response regulatory network

AtWRKY3 in *Arabidopsis* is induced by pathogen infection or salicylic acid treatment (Lai et al. 2008) but its role in drought tolerance is unclear. Here we report that *PtoWRKY68* is a homolog of *AtWRKY3* which functions as an activator of *PtoRD26.1* and *PtoABF2.1* but as a repressor of *PtoDTX49.1*

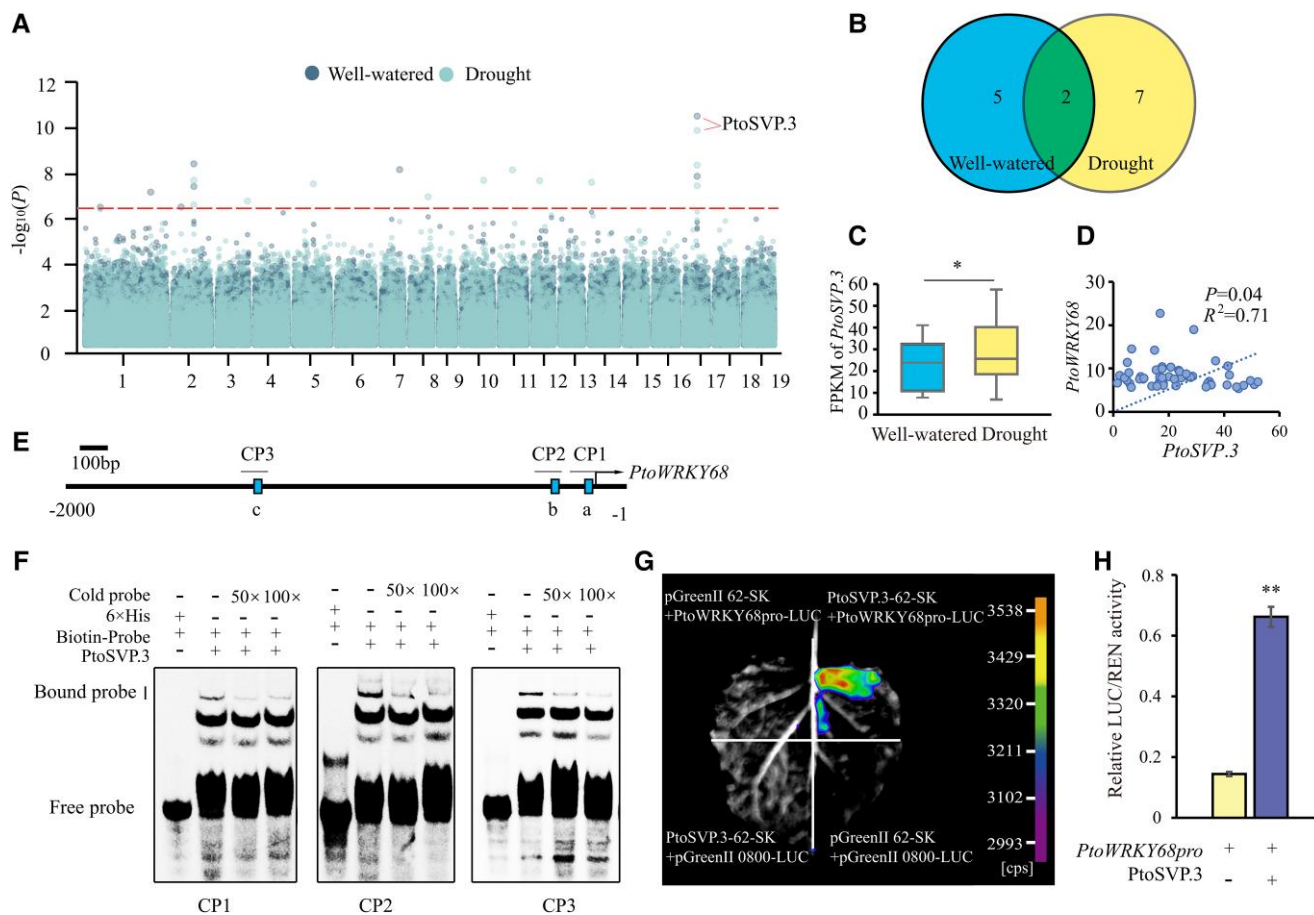


Figure 5. eQTL analysis of *PtoWRKY68* expression under well-watered and drought-stress conditions. **A**) Manhattan plots of eQTL analysis with expression of *PtoWRKY68* under well-watered and drought-stress conditions. Horizontal dashed line, significance threshold ($P < 3.3 \times 10^{-7}$). Arrowhead, candidate gene. **B**) Venn diagram showing the overlap of well-watered and drought-stress genes identified by eQTL analysis. **C**) FPKM values of *PtoSVP.3* under well-watered and drought-stress conditions. In box plots, center line represents the median, box limits denote the upper and lower quartiles, whiskers indicate the interquartile range, and dots are outliers. Error bars are \pm SD. Statistical analysis was performed using the *t*-test, $*P < 0.05$. **D**) Scatter diagram of the correlation between the expression of *PtoSVP.3* and *PtoWRKY68* under drought stress. Dashed line represents linear regression. **E**) Schematic of the locations of CARG motifs in the promoter of *PtoWRKY68*. Solid squares, CARG motifs; short black lines, CARG Probe 1 (CP1); CP2 and CP3 indicate the probes used in **F**). **F**) EMSA. Relative binding affinity of SVP.3 to CARG motifs. Reciprocal competitive EMSA of the binding of recombinant SVP.3 protein to CARG motifs using the indicated biotin-labeled probes and unlabeled competitors. For each probe, 50 \times and 100 \times excess competitor was added. **G**) DLRA of the interaction between *PtoSVP.3* and the *PtoWRKY68* promoter. **H**) Relative luciferase activity by DLRA in *N. benthamiana* leaves. Quantification was performed by normalizing firefly luciferase (LUC) activity to that of *Renilla* luciferase (REN), 35S:REN was used as the internal control. Relative luciferase activities using *PtoSVP.3*-pGreenII62-SK as the effector compared to the control effector (pGreenII62-SK empty vector). Error bars are \pm SD. Statistical analysis was performed using the *t*-test ($n = 8$); statistically significant differences are indicated by $**P < 0.01$. Three independent transfection experiments were performed.

under drought stress. *PtoDTX49.1* is a MATE family member which is a homolog of *AtDTX50* in *Arabidopsis*, participates in ABA efflux and thus negatively regulates drought tolerance. However, how *AtDTX50* and its homologs in other plants are involved in the regulatory cascade of the ABA pathway to response to drought was unclear. We verified the interaction between *PtoWRKY68* and the promoter of *PtoDTX49.1*, and functionally characterized the role of *PtoWRKY68* in modulation of *PtoDTX49.1* expression and ABA accumulation for improving drought tolerance.

The ABFs are core components of the canonical PYR/PYL/RCAR-PP2Cs-SnRK2s-ABFs/ABI5 module of the ABA

signaling pathway, and a variety of stress-responsive genes are regulated by ABF2 in various plants. For example, overexpression of *AtABF2* in *Arabidopsis* activated the expression of the ABA-inducible gene *AtHIS1–3* (Fujita et al. 2005). In this study, *PtoABF2.1*, a homolog of *AtABF2*, which was specifically bound and activated by *PtoWRKY68*, implicating *PtoABF2.1* involve in *PtoWRKY68*-mediated ABA signaling transduction in response to drought stress. In *Arabidopsis*, *AtRD26* is involved in ABA-dependent stress signaling, and the ABA signaling transduction gene *AtRD20* is upregulated by overexpression of *AtRD26* (Fujita et al. 2004). A homolog in poplar (*P. tomentosa* Carr. clone 741), *PtoRD26.1*, is

Table 1. Details of significant SNPs associated with expression of *PtoWRKY68* in the association population of *Populus tomentosa*

Traits	Associated SNP	P-value	Allele	Position	Gene annotation	Description
Well-watered	Chr1_9411429	2.85E-07	A/T	—	—	—
Well-watered	Chr2_13185574	2.97E-08	G/A	Genebody	Ptom.002G.01839	G-box binding factor 3 (GBF3)
Well-watered	Chr2_13186727	2.52E-09	C/T	Genebody	Ptom.002G.01839	G-box binding factor 3 (GBF3)
Well-watered	Chr17_7792185	1.38E-11	T/A	Genebody	Ptom.017G.00699	MADS-box protein SVP-like (SVP.3)
Well-watered	Chr17_7792203	9.78E-09	T/C	Genebody	Ptom.017G.00699	MADS-box protein SVP-like (SVP.3)
Well-watered	Chr7_11563877	4.73E-09	T/C	Genebody	Ptom.007G.01183	Formin homology 2 domain-containing protein (FH2)
Well-watered	Chr2_5270080	2.80E-07	C/T	Genebody	Ptom.002G.00819	STAY-GREEN-like protein (SGRL)
Well-watered	Chr1_40730777	5.51E-08	A/C	Genebody	Ptom.001G.03606	Solaneyl diphosphate synthase (SPS)
Drought	Chr2_13186528	1.53E-08	C/A	Genebody	Ptom.002G.01839	G-box binding factor 3 (GBF3)
Drought	Chr2_13187307	2.22E-07	G/C	Genebody	Ptom.002G.01839	G-box binding factor 3 (GBF3)
Drought	Chr3_18942646	1.46E-07	C/A	Genebody	Ptom.003G.01892	Large subunit ribosomal protein (RP1)
Drought	Chr5_12016609	2.23E-08	C/T	—	—	—
Drought	Chr8_11395818	9.20E-08	G/A	—	—	—
Drought	Chr10_13813433	1.52E-08	A/G	Genebody	Ptom.010G.01912	Cyclopropane-fatty-acyl-phospholipid synthase
Drought	Chr11_8137577	4.93E-09	A/T	Genebody	Ptom.011G.00545	Interleukin-1 receptor-associated kinase 4
Drought	Chr12_4257409	1.60E-08	C/T	Genebody	Ptom.012G.00356	Vesicle-mediated transport
Drought	Chr14_1273549	1.90E-08	C/T	Genebody	Ptom.014G.00168	Basic helix-loop-helix (bHLH) family protein
Drought	Chr17_7793142	6.56E-11	T/A	Genebody	Ptom.017G.00699	MADS-box protein SVP-like (SVP.3)
Drought	Chr17_7785531	2.76E-08	A/G	Genebody	Ptom.017G.00699	MADS-box protein SVP-like (SVP.3)
Drought	Chr17_7792192	2.88E-09	C/T	Genebody	Ptom.017G.00699	MADS-box protein SVP-like (SVP.3)

induced by SRMT and the PtoNF-YC9 complex to respond to salt stress (Tong et al. 2022). The co-expression network of *PtoRD26* in *P. tomentosa* Carr. clone 741 demonstrated that the homologs of *PtoWRKY68* (*P.x_tomentosa21811*), *PtoRD26.1* (*P.x_tomentosa47952*), and *PtoABF2.1* (*P.x_tomentosa01515*) have similar patterns of expression and are involved in drought, salt stress, and the ABA pathway (Tong et al. 2022). We identified and validated the *PtoWRKY68-PtoRD26.1/PtoABF2.1* regulatory pathway in our constructed co-expression network via systems genetics. Therefore, we illustrated the drought-stress-responsive mechanisms, which are composed of *PtoWRKY68*, *PtoABF2.1*, *PtoRD26.1*, and *PtoDTX49.1* together provoke and amplify the ABA-dependent drought response in *P. tomentosa*.

SVP is a temperature-dependent transcriptional repressor of flowering (Andres et al. 2014; Sureshkumar et al. 2016). In addition, it confers drought tolerance by regulating ABA catabolism rather than ABA signaling in *Arabidopsis* (Bechtold et al. 2016; Wang et al. 2018). Our findings suggest a molecular mechanism by which a homolog of *AtSVP*, *PtoSVP.3*, indirectly regulates ABA signaling by interacting with the promoter of *PtoWRKY68* in *P. tomentosa*. These data suggest that *PtoWRKY68* is a master regulator in the *PtoSVP.3-PtoWRKY68-PtoDTX49.1/PtoABF2.1/PtoRD26.1* cascade regulatory network of the ABA-dependent drought-responsive pathway.

Allelic variation in *PtoWRKY68* affects drought tolerance by modulating ABA signaling

The identification of functional SNPs or indels in genes coupled with analyses of their phenotypic impacts has recently been used as an effective approach to elucidate gene function for genetic improvement (Mao et al. 2015; Wang et al. 2016; Han et al. 2018). In this study, a 12 bp indel and

three nonsynonymous variants in *PtoWRKY68* were found to indirectly regulate ABA signaling and accumulation by affecting its efficacy in regulating downstream genes. The data are in line with the fact that drought tolerance is a complex trait controlled by multiple QTLs. These variants divided a natural population of 300 *P. tomentosa* accessions into two haplotype groups representing drought-tolerant (*PtoWRKY68*^{hap1}) and drought-sensitive (*PtoWRKY68*^{hap2}) alleles. Conceivably, the natural distribution of *P. tomentosa*, in terms of water availability, broadly reflects its ability to tolerate drought stress. Populations in water-scarce locations (NE and NW climate regions) are more frequently exposed to drought stress than those in well-hydrated environments (S climate region) (Supplemental Fig. S2). Hence, the drought tolerance conferred by *PtoWRKY68*^{hap1} is likely to be an adaptive mechanism formed by long-term functional differentiation and natural selection.

Similar allelic variation exists in homologs in other *Populus* species (e.g. *PtoWRKY68* and *PagWRKY68*) but the number of Asn-Thr repeats varies by species (Supplemental Fig. S8). These data suggest that the number of Asn-Thr repeats is related to drought tolerance in *Populus* species; however, the drought response mechanisms of different species are diverse and complex and warrant further investigation. Stress-induced phosphorylation of TFs occurs mainly at Ser/Thr sites (Zhao et al. 2021). For example, SnRK2 kinases phosphorylate Ser/Thr residues in an ABA-dependent manner (Nakashima et al. 2009). The question arises as to whether the Thr site of the Asn-Thr repeat unit is a phosphorylation site in *PtoWRKY68* under drought stress.

A potential regulatory pathway and a set of loci implicated in the response to drought stress

Sessile plants have multifaceted strategies to prevent water loss, maintain cellular homeostasis, and persevere through

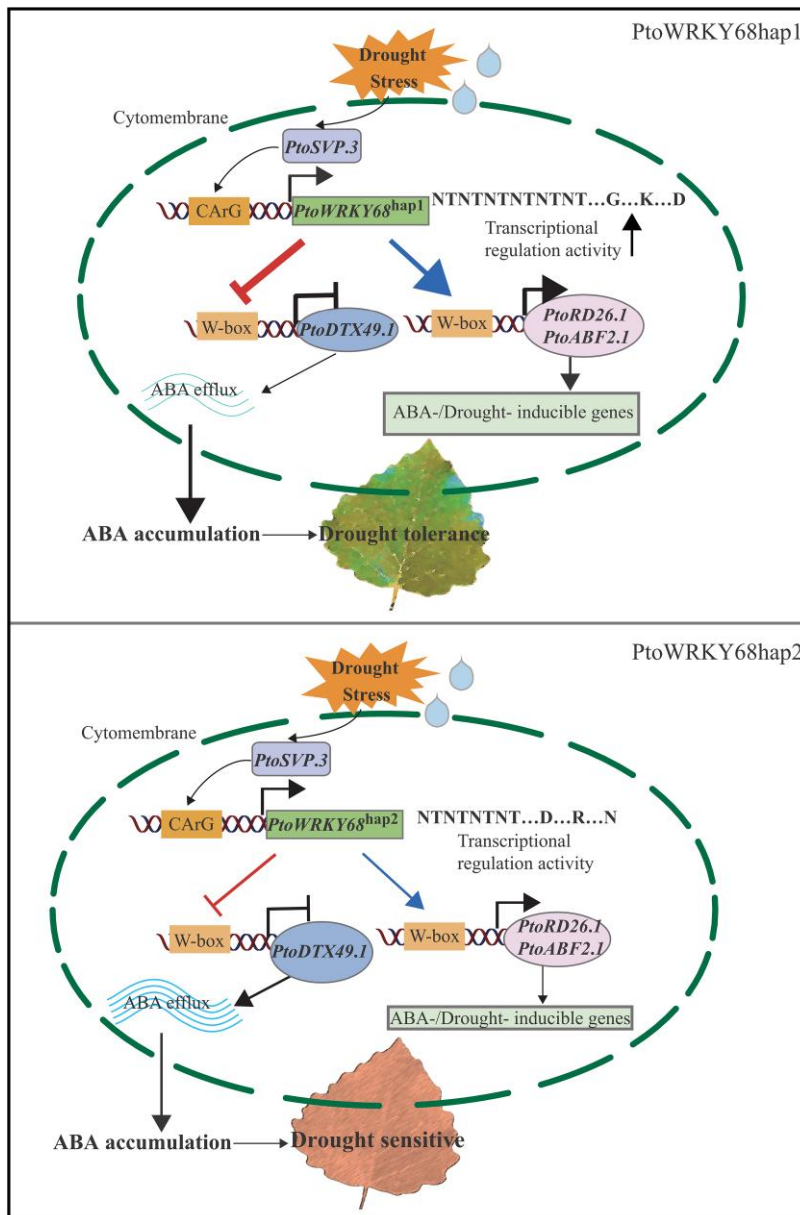


Figure 6. Proposed molecular model of the regulation of the *Populus* drought tolerance regulatory module. Under drought stress, *PtoWRKY68* alleles are positively regulated by *PtoSVP.3*, and the allelic variation in the CDS region of *PtoWRKY68*^{hap1} (above) enhances its binding and activation of *PtoRD26.1* and *PtoABF2.1* and represses *PtoDTX49.1* to confer drought tolerance by modulating ABA efflux and signaling transduction in *Populus tomentosa*. *PtoWRKY68*^{hap2} (below) has lower binding affinity and activation of downstream targets than *PtoWRKY68*^{hap1}. Thus, *PtoWRKY68*^{hap1} accessions show better drought tolerance than *PtoWRKY68*^{hap2} accessions of *Populus*. The arrows indicate promotion, the blunt indicate inhibition. The bold arrow indicates the significantly enhanced expression levels of *PtoRD26.1* and *PtoABF2.1* and the bold blunt indicates the significantly repressed expression levels of *PtoDTX49.1*.

periods of drought. Among seven drought-related physiological and photosynthetic traits, *Gs*, *Ci*, *Tr*, and *Chl* were reduced by drought stress, indicating decreased photosynthesis efficiency and transpiration to prevent water loss (Xiong et al. 2002). ABA, PRO, and WUE were increased by drought stress, mitigating plant cellular damage and ensuring water supply for plants growth (Pinheiro and Chaves 2011). These drought-related measurements showed substantial variability and a high level of repeatability (Fig. 1), suggesting

that these physiological changes have utility as indices of *Populus* drought tolerance.

Numerous genetic factors have been implicated in drought responses and to a lesser extent in drought tolerance, which is a multigenic trait governed by complex regulatory pathways. System genetics has been used to characterize the genetic mechanisms underpinning key regulators of complex traits. In this study, to understand the biological functions of causal genes that are identified by GWAS, we performed co-

expression network analysis under well-watered and drought-stress conditions revealed that both well-watered and drought networks contained *PtoWRKY68*, which was significantly correlated with drought-related traits. By integration of co-expression, DAP-seq and RNA-seq approaches to identify the direct transcriptional targets of *PtoWRKY68*, we found evidence that *PtoWRKY68* plays a prominent role in modulating ABA efflux and multiple ABA signaling core components, including *PtoDTX49.1*, *PtoABF2.1*, and *PtoRD26.1*. These results suggest that *PtoWRKY68* is a key regulator of drought tolerance in *Populus* and may function in an ABA regulatory pathway. The sequence variation in the *PtoWRKY68* CDS region influences its binding ability to these downstream genes, suggestive of an imperative role of co-expression networks in characterizing causal genes. Hence, regulatory network analysis facilitates the explanatory power of GWAS by leveraging prior biological information on gene function (Wang et al. 2010). eQTLs affect complex traits by regulating gene expression and allowing the construction of regulatory networks (Porcu et al. 2019). Therefore, incorporating eQTL information into GWAS analyses will unleash the potential of increasing the power of GWAS by identifying pathways associated with complex traits (Wu and Pan 2018). eQTL analysis showed that the expression of *PtoWRKY68* was regulated by *PtoSVP.3* under both well-watered and drought conditions, highlighting the ability of eQTLs to evaluate the regulatory networks associated with complex traits.

In the post-GWAS era, how to enhance the value of GWAS datasets and reveal the genomic underpinnings of complex phenotypes is a challenge (Leiserson et al. 2013; Jia and Zhao 2014). Systems genetics enables the identification of genetic pathways modulated by master regulators under drought stress in *Populus*. Systems genetics also allows analysis of the molecular regulatory mechanisms of complex traits. Our findings highlight the role of systems genetics, providing insights into how to search for drought-tolerant individuals in a drier atmosphere in the future. Genome editing using the CRISPR-Cas9 system enables the generation of alleles that can improve plant performance under abiotic stresses (Gupta et al. 2020). Allelic variation and the drought tolerance allele (*PtoWRKY68*^{hap1}) are common in *Populus* germplasm adapted to water-scarce conditions, which impact developmental and regulatory pathways to modulate plant growth and production performance under the rapidly changing global climate environment. The identification of the *PtoWRKY68* regulatory module provides insight into the molecular mechanisms that underpin drought tolerance in *Populus* and provides potential targets for engineering drought-tolerant varieties.

Materials and methods

Association population of Chinese white poplar (*Populus tomentosa*)

The population used for association mapping included 300 accessions selected from a clonal arboretum of 1,047

accessions in Guan Xian County, Shandong Province, China (36°23'N, 115°47'E), representing almost the entire natural distribution of *P. tomentosa* (30–40°N, 105–125°E) (Du et al. 2012). The geographic distribution of these 300 accessions was divided into the southern (S, $n = 84$), NW ($n = 108$), and NE ($n = 108$) geographic regions (Huang 1992). In the past 5 yr, the annual average precipitation in the S region was higher than in the NW and NE regions (Supplemental Fig. S2) (<http://www.cma.gov.cn/>). An experimental population of 300 1-yr-old accessions was asexually propagated via grafting with three duplicated cultivations per accession. In the initial growth stage, the water content in the soil was kept at 75% to 80%. Water supply was stopped when the plants were 4-mo-old until the water content in the soil dropped from 20% to 25%. During drought treatment, the soil moisture content was maintained at $\leq 25\%$ for 1 mo before trait evaluation.

Phenotypic data of the *P. tomentosa* association population

To estimate plant responses to drought stress in the *P. tomentosa* population, seven drought-related (photosynthetic and physiological) traits were measured using functional leaves (fourth to sixth leaves from the top of the main stem). Measurements of the *P. tomentosa* population were performed first under well-watered conditions. Subsequently, the same plants were subjected to drought treatment and the drought-related measurements were repeated. Photosynthetic characteristics were measured using the LI-6400 portable photosynthesis system (LI-COR Inc., Lincoln, NE). To reduce the influence of circadian rhythms on photosynthesis, these traits were measured in functional leaves from 9:00 to 11:00 AM on a sunny day. All measurements were performed in triplicate per plant and three biological replications were performed for each accession. WUE was defined as the ratio between CO₂ assimilation and *Tr*.

To quantify PRO content, endogenous PRO was extracted from 0.2 g fresh leaf tissue using 5 mL 6 mol/L hydrochloric acid and hydrolyzed at 110°C for 24 h, neutralized using 5 mL 6 mol/L Na(OH)₂, and centrifuged at 5000 rpm for 10 min. The supernatant (0.5 mL) was transferred to a new tube, and 0.5 mL NaHCO₃ (0.5 mol/L; pH 9.0) and 0.5 mL DNFB reaction solution were added. The mixture was incubated at 60°C for 60 min, cooled to room temperature, and phosphate buffer (pH 7.0) was added to a 5 mL volume. The PRO content was determined using HPLC-1100 (Agilent) with a Symmetry C18 column. To quantify ABA content, ~0.3 g fresh leaf tissue was extracted with 5 mL extraction buffer (80% isopropyl alcohol, 1% formic acid; v/v), at 4°C for 1 h using ultrasound, and centrifuged at 10,000 rpm for 10 min. The supernatant was transferred to a new tube, ultrasonically extracted with 1 mL dichloromethane at 4°C for 30 min, and centrifuged as above. The ABA content was determined via UPLC (Agilent) with a Symmetry C18 column. To quantify Chl content, ~1.0 g fresh leaf tissue was

extracted with 4 mL 0.1% butylated hydroxytoluene-ethanol solution (v/v), at 25°C with shaking in darkness for 4 h. The Chl content was determined via HPLC (Agilent) with a Symmetry C18 column. The percentage reduction or increase of these drought-related traits was calculated using the formula: (measurement of drought-stressed—measurement of well-watered)/measurement of well-watered. Phenotype repeatability was estimated according to broad-sense heritability (h^2) as described previously (Yang et al. 2011; Speed and Balding 2014).

SNP calling following resequencing of the association population

The methods and clean data for resequencing the association population with 300 accessions were previously described (Xiao et al. 2021). In brief, clean reads were aligned to the *P. tomentosa* reference genome by the Burrows–Wheeler Aligner (v. 0.7.5a–r405) using default parameters (Li and Durbin 2009). Low mapping quality (MQ < 20) reads were filtered using SAMtools (v. 1.1) and removed. Genome variant calling was performed using Genome Analysis Toolkit v. 4.0 (<https://gatk.broadinstitute.org/hc/en-us>) with conservative parameters. SNPs with only two alleles were pruned using Vcftools_0.1.13 (Danecek et al. 2011). Following the removal of those with a MAF < 0.05, heterozygous genotype frequency < 0.25, and missing genotype > 0.2, we identified 3,002,432 SNPs across all individuals.

RNA-sequencing analysis

Leaf tissues for RNA-sequencing (RNA-seq) were collected from well-watered and drought-stress-treated plants. The duration of sampling was minimized to reduce changes in gene expression. Total RNA was extracted from the mature leaves of 300 unrelated individuals, using the FastPure Plant Total RNA Isolation Kit (Vazyme, Nanjing, China) according to the manufacturer's instructions. RNA libraries were constructed and sequenced by Novogene (Beijing, China). Paired-end sequencing was performed on the Illumina HiSeq 2005 platform (Illumina, San Diego, CA). Next, clean data were uniquely mapped to the *P. tomentosa* reference genome using TopHat v. 2.1.1 with default options (Trapnell et al. 2009). The isoform levels and gene-level counts of the assembled transcripts were computed and normalized based on FPKM units using Cufflinks v. 2.1.1 with default options (Trapnell et al. 2012). Genes with $q < 0.05$ were identified as DEGs using Cufflinks v. 2.1.1.

Genome-wide association analysis

GWAS was performed in TASSEL v. 5.0 using high-quality data for the 3,002,432 SNPs (Bradbury et al. 2007). The standard mixed linear model was applied, in which the population structure (Q) and kinship (K) were estimated as described previously (Du et al. 2019). For the degree of replication, we performed ten replicate runs with random seed at each value of K from one to ten with 10-fold cross-validation (CV). We calculated the average CV error and standard

deviation for every K-value. K = 3 was used because it separated the S, NE, and NW geographic subpopulations. The SNP set was used to construct a neighbor-joining (NJ) phylogenetic tree. The phylogenetic tree encompassed three clades, consistent with the admixture results. Collectively, K = 3 was the optimal K-value for the separation of subpopulations. The percentage reduction or increase of the seven drought-related traits was normalized by Z-score. The compromised significance threshold for GWAS was set as $P < 3.3 \times 10^{-7}$ ($1/n$, n = effective number of independent SNPs) based on Bonferroni-adjusted correction for multiple testing. LD analysis using the R package, LD heatmap was used to define LD blocks surrounding significant SNPs by intervals (Shin et al. 2006).

Sequence alignment and phylogenetic analysis

To annotate the functions of candidate genes, we performed BLASTP (v. 2.9.0+; $1e-5$) searches of the Swiss-Prot database and the NCBI nonredundant protein database (NR). Sequence alignments were performed using MUSCLE (<http://www.ebi.ac.uk/Tools/msa/muscle>). Using complete protein sequences, the phylogenetic tree was constructed by rooting at the midpoint using the NJ method in MEGA v. 7 (Kumar et al. 2016). The reliability of the tree was estimated by bootstrapping using 2,000 replications. Evolutionary distances were computed using the Poisson correction method. Alignments used for phylogenetic analysis are provided in Supplemental Files S1 to S12.

Vector construction and genetic transformation of *Arabidopsis*

Seeds of *Arabidopsis* (*Arabidopsis thaliana*) ecotype Columbia-0 were surface-sterilized and cold-stratified in sterile water at 4°C for 48 h, followed by germination on agar-solidified 1/2 MS medium (pH 5.8) supplemented with 1% sucrose at 22°C. Seven-day-old seedlings were transplanted in soil and grown in a growth room at 22°C with a 16/8 h diurnal cycle.

The CDSs of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} were PCR-amplified from *P. tomentosa* clones LM50 and 3169, respectively, which were cloned into the *pCXS*N vector under the transcriptional control of the CaMv 35S promoter. The resultant overexpression vector was introduced into *Agrobacterium tumefaciens* strain GV3101, which was used to transform WT *A. thaliana* (Col-0) plants using the floral-dip method (Clough and Bent 1998). Transformants were selected on hygromycin-containing (50 mmol/L) medium and progressed to the T3 generation when the transgene became homozygous. The drought-related traits and relative expression levels of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} were measured in two independent homozygous transformed lines.

Drought tolerance assay

Individual *A. thaliana* plants were grown in pots under short-day conditions (10/14 h, light/dark) in a growth room. Twenty-eight-day-old plants were saturated in water to

95% relative gravimetric soil water content (rSWC), measured daily. For drought treatment, watering was withheld until a 17% rSWC was reached. Control plants were maintained under well-watered conditions at a 95% rSWC. The experiments were performed three times, and each experiment contained 12 plants per line. The gross fresh weight of the detached leaves of five plants was measured to assess water loss. The water loss rate was calculated using the formula: water loss rate (%) = $(FW - DW)/FW \times 100$, where FW is the leaves the fresh weight of harvest, and DW is the fresh weight of leaves detached at 10 min intervals.

RT-qPCR analysis

Transgenic and WT *A. thaliana* plants were maintained in a greenhouse under well-watered or drought-stress conditions, with three independent biological replicates. Total RNA was extracted from the mature leaves of seedlings using the FastPure Plant Total RNA Isolation Kit (Vazyme, Nanjing, China) according to the manufacturer's instructions. Total RNA was reverse transcribed into first-strand cDNA using the Reverse Transcription System (Promega Corporation, Madison, WI). After the inactivation of enzymes by heating, a 0.5 μ L aliquot was used for RT-qPCR on a QuantStudio 6 Flex Real-Time PCR System (Thermo Fisher Scientific, Waltham, MA) using SYBR Premix Ex Taq (TaKaRa, Dalian, China) according to the manufacturer's protocol. 18S rDNA and *ACTIN2* (AT3G18780) were used as the internal controls. PCR involved preincubation at 95°C for 30 s, followed by 40 cycles of 95°C for 5 s and 60°C for 30 s, and dissociation at 60°C to 95°C at 0.05°C s⁻¹. The relative transcript abundance of candidate genes was calculated using the 2^{- $\Delta\Delta$ Ct} method (Livak and Schmittgen 2001). The transcript levels of candidate genes in transgenic lines were relative to the expression in WT plants. Three biological replicates were performed, each of which consisted of three technical repeats. The primers used are listed in Supplemental Table S3.

ABA-sensitivity assay in transgenic *Arabidopsis* and *P. tomentosa* accessions

Leaves of six *P. tomentosa* accessions and both transgenic and WT plants were immersed in stomatal opening buffer (10 mM MES, 5 mM KCl, 50 mM CaCl₂, pH 6.15) for 3 h before being transferred to opening buffer with 1 μ M ABA. The stomatal aperture was measured every 30 min for 90 min. Epidermal strips were peeled and photographed using a DMi8 microscope (Leica Biosystems, Nussloch, Germany). Stomatal apertures were measured using Image J software (<http://rsb.info.nih.gov/ij>).

To assess the impact of ABA on seed germination, surface-sterilized seeds from transgenic and WT *A. thaliana* were plated on a solid 1/2 mS medium with ABA (0, 0.5, and 1 μ M). The rates of seed germination were recorded daily and photographed on days 4 and 7. To measure root length, sterilized seeds of the transgenic lines and WT were

germinated on 1/2 mS medium, and 5-d-old seedlings were transplanted to fresh medium with ABA (0, 1, and 3 μ M) for 7 d; subsequently, root length and the number of lateral roots were analyzed (Shang et al. 2010; Seo et al. 2012; Zhang et al. 2014; Ma et al. 2019). Root elongation of *A. thaliana* plants was analyzed using Image J.

Weighted gene co-expression network analysis

WGCNA was applied to analyze the RNA-seq data of 55 accessions randomly selected from the natural population of *P. tomentosa*. The expression of 34,106 genes in well-watered and drought-stress samples of these 55 accessions was evaluated from the RNA-seq dataset. On average, 24,381 genes were detected in 80% of the samples, and 9,714 genes were significantly differentially expressed between well-watered and drought-stress samples ($P < 0.001$, *t*-test). Log₁₀(FPKM + 1) was used to normalize FPKM values, which were used to generate co-expression networks with the WGCNA package in R (Langfelder and Horvath 2012). Independent signed networks were constructed from well-watered and drought-stress time-course samples. An adjacency matrix was constructed using soft threshold powers of four and nine under well-watered and drought-stress conditions, respectively. Network interconnectedness was measured by calculating the topological overlap using the TOMdist function with a signed TOMType. Average hierarchical clustering using the hclust function was performed to group the genes based on the topological overlap dissimilarity measure (1-TOM) of their connection strengths. Network modules were identified using a dynamic tree-cut algorithm with a minimum cluster size of 30 and a merging threshold function of 0.25. To identify hub genes within the modules, module membership for each gene was calculated based on the Pearson correlation between the expression level and the module eigengene. Genes within the module with the highest module membership were considered highly connected within that module. To test the correlations between each module and the photosynthetic and physiological traits, the module eigengenes were correlated with the physiological data.

DAP-seq sampling and data analysis

DAP-seq was carried out as described previously (Bartlett et al. 2017) and performed at Bluescape Hebei Biotech to purify gDNA from the leaves of *P. tomentosa* clone LM50. A genomic DNA library was prepared using the NGS0602-MICH TLX DNA-Seq Kit (MICH, Hebei, China). The coding sequences of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2} were cloned into pFN19K HaloTag T7 SP6 Flexi vector and expressed using the TNT SP6 Coupled Wheat Germ Extract System (Promega, Madison, WI). *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap1} bead mixtures were incubated with the genomic DNA library. Eluted DNA was sequenced on an Illumina NavoSeq6000 with two technical duplicates. DAP-seq reads were aligned to the reference *P. tomentosa* genome (CRA000903) using Bowtie2 (Langmead and Salzberg 2012).

The conserved motifs in peaks were identified via MEME-ChIP (Machanick and Bailey 2011). We performed KEGG analysis using the KOBAS v. 2.0 database (<http://kobas.cbi.pku.edu.cn/>). *PtoWRKY68* target genes were defined as peaks located 2 kb upstream of ATG.

Expression quantitative trait loci analysis

eQTL analysis was conducted using the normalized relative transcript abundances of *PtoWRKY68* from 300 accessions under each condition as the phenotypic variable in the GWAS analysis. The standard mixed linear model and the compromised significance threshold were consistent with the above GWAS.

Prediction of cis-elements

A 2 kb DNA fragment spanning upstream of the start codon ATG of *PtoWRKY68* was extracted as its promoter sequence, from which cis-regulatory elements were predicted in silico using PlantTFDB v. 5.0 software (<http://planttfdb.gao-lab.org/index.php>) (Tian et al. 2020). CARG motifs in the *PtoWRKY68* promoter region were identified as described previously (Tang and Perry 2003; Li et al. 2008). The primers used for PCR of the promoter sequence are shown in Supplemental Table S3.

Electrophoretic mobility shift assay

The full-length CDSs of *PtoWRKY68*^{hap1}, *PtoWRKY68*^{hap2}, and *PtoSVP.3* were amplified by PCR, and individually cloned into the *Bam*HI/*Sall* sites of the expression vector pET-32a-HIS using the ClonExpress II One Step Cloning Kit (Vazyme, Nanjing, China). Following expression in *Escherichia coli* BL21 (DE3), the recombinant *PtoWRKY68*^{hap1}, *PtoWRKY68*^{hap2}, and *PtoSVP.3* proteins were purified using the His-Tagged Protein Purification Kit (Cwbio, Taizhou, China), diluted in PBS buffer (135 mM NaCl, 4.7 mM KCl, 10 mM Na₂HPO₄, and 2 mM NaH₂PO₄; pH 7.4), and quantified on a NanoDrop 8000 Spectrophotometer (Thermo Fisher Scientific, Waltham, MA). Motif DNA representing target gene promoters was synthesized by annealing the forward and reverse complementary oligos containing W1-box, W2-box, and CARG elements (Supplemental Table S3). EMSA was performed using an EMSA Kit (Beyotime, Shanghai, China). DNA–protein complexes were fractionated on a non-denaturing 6% polyacrylamide gel, transferred to a positive nylon membrane, and UV cross-linked. Complexes were detected using streptavidin-HRP conjugate with an Enhanced Chemiluminescence (ECL) Kit (Beyotime).

Dual-luciferase reporter assay

DLRA was conducted as described previously (Hellens et al. 2005). Briefly, *PtoWRKY68*^{hap1}, *PtoWRKY68*^{hap2}, and *PtoSVP.3* cDNAs were individually cloned into the *Bam*HI/*Sall* sites of the effector plasmid pGreenII 62-SK using the ClonExpress II One Step Cloning Kit (Vazyme, Nanjing, China). The promoters of *PtoABF2.1*, *PtoDTX49.1*, *PtoRD26.1*, and *PtoWRKY68*

have cloned into the *Sall*/*Hind*III sites of the reporter plasmid pGreenII 0800-LUC with the 35S promoter-driven Renilla luciferase (REN) gene. These constructs were introduced to *A. tumefaciens* GV3101 (pSoup-p19). Equal concentrations and volumes of *A. tumefaciens* constructs, promoter-LUC, pGreenII 0800-LUC, *PtoSVP.3*/*PtoWRKY68*–62-SK, and pGreenII62-SK were co-infiltrated into abaxial mesophyll cells in fully expanded *Nicotiana benthamiana* leaves using needle-free syringes, followed by incubation at room temperature for 48 to 60 h (Chen et al. 2008). The infiltrated *N. benthamiana* leaves were sprayed with 1 mM D-fluorescein and photographed using an LB983 Night Owl II fluorescence imaging system (Berthold Technologies, Bad Wildbad, Germany). Quantification was performed by normalizing firefly luciferase (LUC) activity to that of REN, using 35S:REN as the internal control. Luciferase activity was assayed using the DLRA system (Beyotime) according to the manufacturer's instructions. DLRA were performed in at least triplicate. Relative luciferase activities using *PtoWRKY68*/*PtoSVP.3*-pGreenII62-SK as the effector was compared to the control effector (pGreenII62-SK empty vector).

Statistical analysis

Statistical significance was determined by *t*-test or one-way ANOVA with Tukey's test analysis using the IBM SPSS Statistics 25.0 software (IBM SPSS, Chicago, USA). Significant differences were indicated by **P* < 0.05, ***P* < 0.01, or ****P* < 0.001, ns, with no significant difference.

Accession numbers

Sequence data in this study has been submitted to GenBank: accession numbers OQ789667–OQ789672. The RNA-seq of *P. tomentosa* under well-water and water-deficient phases, DAP-seq of *PtoWRKY68*^{hap1} and *PtoWRKY68*^{hap2}, and genome resequencing of *P. tomentosa* are available at the BIGD Genome Sequence Archive (<https://bigd.big.ac.cn>) under accession number CRA007408, CRA009302, CRA009303, and CRA000903, respectively. Sequence data used in this article can be found in the Arabidopsis Information Resource (<https://www.arabidopsis.org/index.jsp>) under the following accession numbers: *AtNCED3* (AT3G14440), *AtRD20* (AT2G33380), *AtRD29B* (AT5G52300), *AtHIS1–3* (AT2G18050), *AtSnRK2.6* (AT4G33950), and *AtABI2* (AT5G57050).

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Author contributions

D.Z. designed the experiment and conception; Y.F., D.W., and X.L. performed the experiments; Y.F. wrote the manuscript; W.Q., F.S., and S.Q. helped to collect and analyze the data;

L.X., M.Q., and J.Z. provided the valuable suggestions on the manuscript; Q.D., Q.L., and Y.E.K. helped to revise the manuscript; D.Z. obtained the funding and were responsible for this manuscript. All authors read and approved the manuscript.

Supplemental data

The following materials are available in the online version of this article.

Supplemental Figure S1. Seven drought-related traits of *P. tomentosa* under well-watered and drought-stress conditions in three climate regions.

Supplemental Figure S2. Average precipitation in the past 5 yr in *P. tomentosa* distribution regions.

Supplemental Figure S3. Manhattan plots of GWAS with six drought-related traits.

Supplemental Figure S4. Phylogenetic consensus trees of PtoDUF3598 and PtoWRKY68 in different species.

Supplemental Figure S5. Drought tolerance of transgenic *Arabidopsis thaliana* overexpressing *PtoWRKY68*.

Supplemental Figure S6. Sequence alignment of PtoWRKY68^{hap1} and PtoWRKY68^{hap2} proteins.

Supplemental Figure S7. Drought-stress phenotype of WT, *PtoWRKY68*^{hap1}, and *PtoWRKY68*^{hap1} transgenic plants.

Supplemental Figure S8. Sequence alignment of *PtoWRKY68* homologs in other *Populus* species.

Supplemental Figure S9. Dynamic changes in drought-related traits are correlated with co-expression networks.

Supplemental Figure S10. Phylogenetic consensus tree of PtoABF2.1 in different species.

Supplemental Figure S11. Phylogenetic consensus tree of PtoRD26.1 in different species.

Supplemental Figure S12. Phylogenetic consensus tree of PtoDTX49.1 in different species.

Supplemental Figure S13. *PtoWRKY68* alleles positively regulated ABA-/drought-inducible genes and were associated with ABA-related phenotypes.

Supplemental Figure S14. Verification and RT-qPCR analysis of *svp* mutants.

Supplemental Table S1. Details of significant SNPs associated with drought-related traits in the association population of *P. tomentosa*.

Supplemental Table S2. Conserved hub genes (intramodular connectivity > 20) were detected using WGCNA.

Supplemental Table S3. Oligonucleotide sequences of the primers used in this study.

Supplemental Data Set 1. Variations in a genomic region of *PtoWRKY68*.

Supplemental Data Set 2. Well-watered network gene lists with module membership and gene significance for each drought-related trait.

Supplemental Data Set 3. Drought network gene lists with module membership and gene significance for each drought-related trait.

Supplemental Data Set 4. DEGs in *PtoWRKY68*hap1 vs. *PtoWRKY68*hap2 haplogroups with a significant difference ($P < 0.05$) and at least 2-fold change.

Supplemental File 1. DUF3598 homologs sequence alignment.

Supplemental File 2. DUF3598 homologs phylogenetic consensus tree.

Supplemental File 3. WRKY I genes sequence alignment.

Supplemental File 4. WRKY I genes phylogenetic consensus tree.

Supplemental File 5. ABF2 homologs sequence alignment.

Supplemental File 6. ABF2 homologs phylogenetic consensus tree.

Supplemental File 7. RD26 homologs sequence alignment.

Supplemental File 8. RD26 homologs phylogenetic consensus tree.

Supplemental File 9. MATE efflux family protein sequence alignment.

Supplemental File 10. MATE efflux family protein phylogenetic consensus tree.

Supplemental File 11. MADS-box protein SVP homologs sequence alignment.

Supplemental File 12. MADS-box protein SVP homologs phylogenetic consensus tree.

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Conflict of interest statement. The authors declare that they have no conflict of interests.

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