# Plant Physiology®

# A superior gene allele involved in abscisic acid signaling enhances drought tolerance and yield in chickpea

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The author responsible for distribution of materials integral to the findings presented in this article in accordance with the policy described in the Instructions for Authors (https://academic.oup.com/plphys/pages/General-Instructions) is: Swarup K. Parida (swarup@nipgr.ac.in).

# Abstract

Identifying potential molecular tags for drought tolerance is essential for achieving higher crop productivity under drought stress. We employed an integrated genomics-assisted breeding and functional genomics strategy involving association mapping, fine mapping, map-based cloning, molecular haplotyping and transcript profiling in the introgression lines (ILs)- and near isogenic lines (NILs)-based association panel and mapping population of chickpea (*Cicer arietinum*). This combinatorial approach delineated a bHLH (basic helix–loop–helix) transcription factor, *CabHLH10* (*Cicer arietinum* bHLH10) underlying a major QTL, along with its derived natural alleles/haplotypes governing yield traits under drought stress in chickpea. CabHLH10 binds to a *cis*-regulatory G-box promoter element to modulate the expression of *RD22* (responsive to desiccation 22), a drought/abscisic acid (ABA)-responsive gene (via a *trans*-expression QTL), and two strong yield-enhancement photosynthetic efficiency (PE) genes. This, in turn, upregulates other downstream drought-responsive and ABA signaling genes, as well as yield-enhancing PE genes, thus increasing plant adaptation to drought with reduced yield penalty. We showed that a superior allele of *CabHLH10* introgressed into the NILs improved root and shoot biomass and PE, thereby enhancing yield and productivity during drought without compromising agronomic performance. Furthermore, overexpression of *CabHLH10* in chickpea and Arabidopsis (*Arabidopsis thaliana*) conferred enhanced drought tolerance by improving root and shoot agro-morphological traits. These findings facilitate translational genomics for crop improvement and the development of genetically tailored, climate-resilient, high-yielding chick-pea cultivars.

Received May 24, 2022. Accepted October 15, 2022. Advance access publication December 7, 2022

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# Introduction

The major staple food cereal and legume crops are severely affected by drought, which causes substantial yield and productivity losses world-wide (Fang et al., 2010; Varshney et al., 2018a, b). Chickpea (*Cicer arietinum* L.) is an economically important major grain legume crop cultivated by the resource-poor farmers in the arid and the semi-arid regions across the globe (Varshney et al., 2013a). Since approximately 90% of the world's chickpea is widely cultivated on residual soil moisture in rainfed environments, its productivity is adversely affected by terminal drought stress resulting in substantial (more than 50%) annual yield losses (Varshney et al., 2018a, b). It is, therefore, crucial to develop high-yielding, climate-ready chickpea varieties that can sustain drought stress to ensure global food security.

Terminal drought is a type of soil moisture stress where the crop grows and matures on gradually depleting soil moisture with increasing severity at the time of maturity towards end of the growing season (Gaur et al., 2015). It predominantly affects diverse agro-morphological, physiological and yield component traits including anthesis, pollen viability/fertilization, pollen tube growth, stigma/style function, fertility, pod filling, pod size, seed growth/development, and photosynthetic efficiency (PE) leading to low pod/seed number, reduced biomass and harvest index, consequently resulting in low seed yield and productivity in chickpea (Fang et al., 2010; Mir et al., 2012; Hamwieh et al., 2013; Krishnamurthy et al., 2013; Nakashima et al., 2014; Pang et al., 2017).

Plants have evolved wide arrays of adaptive mechanisms including morphological, physiological, biochemical, cellular, and molecular responses to cope up with drought stress (Abe et al., 2003). The phytohormone abscisic acid (ABA) plays a major role in regulating the response and tolerance against drought stress by inducing the expression of a diverse array of downstream drought- and ABA-responsive genes (Abe et al., 2003). Drought triggers plants to accumulate ABA through induction of ABA biosynthetic genes leading to various agromorphological and physiological changes such as stomatal closure, reduced leaf size, water-use efficiency, inhibition of shoot growth, lateral root formation, and root elongation (Abe et al., 2003; Umezawa et al., 2010). Certain key mechanisms involve ABA-mediated stomatal closure to reduce transpiration and minimize water loss and/or enhance root cell elongation so as to maximize water uptake during drought stress (Tuteja, 2007; Muhammad Aslam et al., 2022).

Despite numerous reports on the role of ABA in plant drought tolerance, its effect on crop yield performance during drought is unexpectedly meagre and thus far from comprehensive (Bao et al., 2016). Several studies, however, suggest that ABA improves biomass and grain yield under moderate drought conditions in wheat (*Triticum aestivum*; Travaglia et al., 2007, 2010), soybean (*Glycine max*; Travaglia et al., 2009), rice (*Oryza sativa*; Yang et al., 2001, 2004) and rapeseed (*Brassica napus*; Wang et al., 2005) by enhancing carbon allocation, transportation and their active

partitioning in seeds. Since ABA has a positive effect on grain filling during drought, optimizing the physiological processes in response to ABA signalling has the potential to improve drought tolerance without compromising yield. Improving drought tolerance without compromising yield and productivity in water-limited environments is a major challenge in crop improvement program (Venuprasad et al., 2007). Identifying key traits that maximizes crop yield and productivity under drought stress is therefore critical to develop high-yielding, drought-tolerant crops (Varshney et al., 2018a). Various key physiological traits contributing to yield under drought stress include early maturity, leaf water potential, relative water content, water-use efficiency, transpiration efficiency, carbon isotope discrimination ( $\Delta^{13}$ C), crop growth and partitioning rate, root traits, shoot biomass, and PE (Upadhyaya et al., 2012; Kashiwagi et al., 2013, 2015; Krishnamurthy et al., 2013; Ramamoorthy et al., 2016; Basu et al., 2019). Considerable progress has been made in improving drought tolerance and yield through direct selection for major yield traits including pod number, seed number, seed weight, and yield per plant during drought stress in several crops such as rice (Guan et al., 2010; Venuprasad et al., 2007, 2008; Raman et al., 2012), wheat (Sivamani et al., 2000; Guóth et al., 2009), and chickpea (Talebi and Karami, 2011; Upadhyaya et al., 2012; Varshney et al., 2014a). Similarly, modification of root system architecture is another vital trait for improving crop grain yield due to its ability to efficiently absorb water from deeper soils in water-limited environments (Kashiwagi et al., 2015; Prince et al., 2017). Therefore, direct selection of seed yield in conjunction with various yield component traits under drought stress appears to be the most promising strategy for selecting stable, durable, and high-yielding crop genotypes in drought-prone environments (Kashiwagi et al., 2015; Prince et al., 2017).

Deciphering the genetic and molecular mechanism governing complex drought-tolerance traits is essential for genomics-assisted crop improvement in order to develop high-yielding, drought-tolerant crops varieties. Traits contributing to drought tolerance are generally complex quantitative with multifaceted nature, low heritability and also influenced by large genotype-by-environment  $(G \times E)$  interactions (Varshney et al., 2014a; Kashiwagi et al., 2015). Transcription factors (TFs) like MYC (myelocytomatosis), MYB (myeloblastosis), NAC [NAM (no apical meristem), ATAF (Arabidopsis transcription activator factor), and CUC (cup-shaped cotyledon)], ABF [ABRE (ABA-responsive element)-binding factors)], ABI (ABA-insensitive), bZIP (basic leucine zipper), and dehydration-responsive element-binding are the key regulators that play the vital role in drought response by modulating the expression of a diverse array of specific downstream genes via either ABA-dependent and ABA-independent signaling pathways (Singh and Laxmi, 2015; Sah et al., 2016). Numerous other genes involved in these pathways essentially encode diverse sets of biosynthetic enzymes [ZEP (zeaxanthin epoxidase), AAO3 (ABA-aldehyde oxidase 3), NCED3 (9-cis-epoxycarotenoid dioxygenase 3), ABA3

(ABA-deficient 3)], receptors [PYR (pyracbactin resistance), PYL (pyracbactin resistance-like), ABP9 (ABRE binding protein 9), OST1 (open stomata1)] as well as ABRE and DRE cis-elements binding factors (Singh and Laxmi, 2015; Dar et al., 2017). Substantial efforts have been made in the genetic and molecular dissection of various complex drought-tolerance guantitative traits that contribute to higher yield in a variety of crop species including rice, wheat, and soybean (Maccaferri et al., 2008; Li et al., 2013; Uga et al., 2013; Selvaraj et al., 2017; Mao et al., 2022; Zhao et al., 2022) as well as the model plant Arabidopsis (Arabidopsis thaliana) (Abe et al., 2003; Ramírez et al., 2009; Roca et al., 2019). Unfortunately, no such comprehensive efforts so far on understanding the complex genetic architecture of drought-tolerance traits contributing to higher yield and productivity are being made in chickpea. No single robust gene and allele has been identified yet to confer drought tolerance and enhance chickpea crop yield and productivity in multiple genetic backgrounds/environments without associated epistatic/pleiotropic effects on other desirable agro-morphological traits. This lack of functionally relevant drought-tolerance gene and natural allele impedes efforts for marker-assisted genetic improvement and development of drought-tolerant, high-yielding cultivars of chickpea.

In this study, we employed a combined genomics-assisted breeding and functional genomics strategy to decipher the genetic and molecular architecture of complex droughttolerance quantitative traits in chickpea. Using a phenotypically well-characterized near-about homogeneous introgression lines (ILs)- and near isogeneic lines (NILs)-based association panel and mapping population, we successfully delineated CabHLH10, a promising transcription factor (TF) gene of a major quantitative trait locus (QTL) and its derived natural alleles governing yield/productivity traits under drought stress in chickpea. CabHLH10 confers drought tolerance as well as enhances yield and productivity during drought stress by modulating the transcriptional regulation of its targets including RD22, a drought-responsive gene and two yield-enhancing PE genes in response to ABA signaling. We showed that CabHLH10 binds to cis-regulatory G-box promoter elements of RD22 and PE genes via a trans-expression QTL (trans-eQTL). This effect in turn upregulates other downstream drought-responsive ABA signaling as well as PE genes, thereby enhancing drought tolerance with increased yield and productivity. We successfully introgressed a superior natural allele of CabHLH10 via marker (haplotype)-assisted selection to develop a drought-tolerant chickpea cultivar with enhanced yield and productivity without compromising its agronomic performance.

### Results

# GWAS and regional association analysis scan potential genomic loci associated with yield traits under drought stress in chickpea

To identify genomic loci associated with yield/productivity traits under drought stress in chickpea, an association panel comprising 222 near-about homogeneous ILs was

constituted for GWAS (Supplemental Figures 1 and 2; Supplemental Table 1). For large-scale discovery and highthroughput genotyping of SNPs at a genome-wide scale, whole-genome resequencing of these 222 ILs along with seven desi, kabuli and wild chickpea accessions (used as parents to develop ILs) was performed. This produced a total of  $\sim$ 336.5 Gb sequence data with an average sequencing depth of ~2.0X (1.6 Gb) per IL/accession, demonstrating 87.5% coverage of the reference chickpea genome (Supplemental Table 2). This altogether discovered  $\sim$ 2.3 million high-quality SNPs of which 110110 SNPs were genotyped in all 222 ILs belonging to an association panel (Supplemental Table 3). The identified SNPs were structurally and functionally annotated on the diverse coding, and non-coding intronic and upstream/downstream regulatory (URR/DRR) sequence components of 16114 genes (44933 SNPs) as well as intergenic regions (65177 SNPs) representing eight chromosomes and unanchored scaffolds of chickpea genome (Supplemental Figure 3, Supplemental Figure 4, A–D).

The use of 48167 chromosome-wise SNPs with high minor allele frequency (MAF > 0.13) in the phylogenetic tree construction, population structure and principal component analysis (PCA) clustered the association panel of 222 ILs into a single population group (POP I) and exhibited very low population genetic structure (0.061 mean Fst) (Figure 1, A-B; Supplemental Figure 5, A-D). The association panel representing POP I exhibited significant linkage disequilibrium (LD) decay at a physical distance of 100 kb across the chromosomes (Figure 1C). The large-scale multienvironment field phenotyping of 222 ILs belonging to an association panel exhibited wide phenotypic variation and high heritability for seven yield traits under irrigated (unstressed) versus unirrigated (drought stress) conditions including drought yield index per plant/hectare [DYI(P/H)] across three individual and over all years (Supplemental Figures 6 and 7; Supplemental Table 4).

GWAS analysis was performed by integrating the yield traits phenotyping data during unstressed irrigated and drought stress unirrigated conditions with genome-wide genotyping information of 48167 chromosome-wise SNPs and genetic relatedness (single population with very low population genetic structure) data among 222 ILs of an association panel. This analysis detected 14 genomic loci in 12 genes mapped on five chromosomes showing significant association with the yield traits in at least across two of the three environments under both unstressed and drought stress conditions including DYI(P/H) (Figure 1, D-E; Supplemental Figures 8 and 9; Supplemental Table 5). The phenotypic variation explained (PVE) by the 14 associated genomic loci for DYI(P/H) traits varied from 10.0% to 28.7%  $(10^{-8} \text{ to } 10^{-9} \text{ P})$  (Supplemental Table 5). Among 14 loci, two informative SNPs [Ca1:12709839(T/A) and Ca1:12709928(G/T)] in the URR of a bHLH (basic helix-loop-helix) TF gene, mapped on chromosome 1, exhibited strong association (27.6%-28.7% PVE,  $10^{-9}$  P) with DYI(P/H) across all three environments (Figure 1, D-E; Supplemental Table 5). The use of



Figure 1 High-resolution association mapping identified potential genomic loci showing strong association with DYI in chickpea. Determination of molecular diversity, phylogenetic relationship, and historical recombination (LD) among 222 introgression lines (ILs) in an association panel based on (A) unrooted phylogenetic tree construction, (B) PCA and (C) LD decay (mean  $r^2$ ) estimation using 48167 SNPs mapped across eight chromosomes. Digits mentioned in the clades of phylogenetic tree correspond to IL numbers given in the Supplemental Table 1. The scale bar (scale: 0.1) below the phylogenetic tree refers to the evolutionary distances computed based on units of the number of nucleotide substitutions per site. B, In PCA, clustering of all 222 ILs into a single population group (POP I) in which the PC1 and PC2 explained 16.8% and 15.3% of the total variance, respectively. C, In the LD decay, the plotted curved lines representing a population (POP I) signify the mean  $r^2$  values among SNPs spaced with uniform 50 kb physical intervals from 0 to 250 kb across chromosomes. The dotted line represents the significant LD decay in a population of constituted chickpea association panel. \*Significant difference of mean r<sup>2</sup> value at a 100 kb chromosomal physical position as compared to that estimated at 0, 50, 150, and 250 kb (P < 0.001, Student's t-test). D and E, GWAS-derived Manhattan plots generated using 48167 chromosome-wise SNPs showing the significant P values of genomic SNP loci associated with drought yield index per plant [DYI(P)] (D) and drought yield index per hectare [DYI(H)] (E) across years. The SNP genotyping and DYI(P/H) trait phenotyping information evaluated among 222 ILs were analyzed under both irrigated (unstressed) and unirrigated (drought stress) conditions by three individual years (2012, 2013, and 2014) and using the overall mean across three years (over all years) to generate the Manhattan plots. The genomic distribution of SNPs mapped on eight chromosomes is indicated on the x-axis. The y-axis shows the  $-log_{10}$  (P) values for SNP loci associated with DYI(P/H) trait. The SNPs exhibiting significant association with DYI(P/H) at a cutoff P value  $\leq 10^{-8}$  are indicated by dotted lines. F, Gene-by-gene regional association analysis-derived local Manhattan plot and (G) highresolution LD heat map covering a 120-kb genomic interval (12.60-12.72 Mb with 15 genes) (highlighted with red dotted lines) surrounding the strong [DYI(P/H)]-associated SNP loci [Ca01:12709839(T/A) and Ca01:12709928(G/C)] in the upstream regulatory region (URR) of a CabHLH10 mapped on chromosome 1. Arrows indicate the genomic positions of DYI(P/H)-associated SNPs identified across three years (over all years) on chromosome 1. In the LD heat map,  $R^2$  indicates the frequency correlation among pair of alleles across a pair of SNP loci. CaChr01-08 denote Cicer arietinum chromosomes 01-08. DYI(P/H): drought yield index per plant/hectare.

chromosome-wise 48167 SNPs much higher (six times) than the required minimal SNP-density of 7400 SNPs to cover the significant LD (100 kb LD decay) in a chickpea genome for GWAS indicates robustness of high-resolution trait association mapping information generated in the present investigation. Therefore, the trait-associated genomic loci uncovered by GWAS have functional relevance for understanding the complex genetic architecture of quantitative yield traits during drought stress in chickpea.

Gene-by-gene regional association analysis was performed to validate the association potential of GWAS-derived genomic loci for yield traits under drought stress in chickpea. For this, 100 kb genomic region (exhibiting significant LD decay) flanking the trait-associated URR-SNPs in a *bHLH* gene was selected for high-coverage targeted sequencing to discover the high-quality SNPs. The SNP genotyping data was further correlated with multi-environment DYI(P/H) trait phenotyping information of an association panel (222 ILs) for regional association study. This delimited a shortest 120 kb genomic interval (12.60–12.72 Mb with 15 genes) of significant LD resolution (0.87 mean  $R^2$ ) covering the either side of GWAS-derived URR-SNPs in a *bHLH* which is strongly associated with DYI(P/H) (Figure 1, F–G). Within this LD-block, comprehensive gene-by-gene regional association analysis targeting 15 annotated genes exhibited strong association (34.7% PVE, 10<sup>-11</sup> P) of these regulatory SNPs in a *bHLH* with DYI(P/H) in chickpea.

# Fine-mapping and map-based cloning delineate a *CabHLH10* TF gene of a major QTL governing yield traits under drought stress in chickpea

To validate the involvement of GWAS trait-associated genomic loci (bHLH) in conferring drought tolerance to chickpea, molecular mapping of the major drought-responsive QTL and its subsequent fine-mapping/map-based cloning were performed. For high-resolution QTL mapping, a highdensity genetic linkage map was constructed using an RIL population [LDYI(P/H)-IL-77 × HDYI(P/H)-IL-105] by assigning 7092 SNPs on eight chromosomes with an average mapdensity of 0.157 cM (Supplemental Figure 10; Supplemental Table 6). The genome-wide genotyping data of SNPs mapped on a high-density genetic linkage map was further integrated with multi-environment DYI(P/H) field phenotyping information for 190 mapping individuals of an RIL population. This analysis detected two major genomic regions harboring seven robust (validated across three individual and over all environments) QTLs governing yield traits under drought stress including DYI(P/H) mapped on chromosomes 1 and 4 of chickpea (Figure 2, A–B; Supplemental Figure 10). The phenotypic variation explained (PVE) by the QTLs varied from 21.8% to 41.3% (11.3-17.6 LOD).

The major drought-responsive robust 1.7-cM CaqDYI(P/H) 1.1 QTL genomic interval harboring the bHLH on chromosome 1 with the maximum PVE (41.3%) and LOD (17.6), was selected for fine mapping and map-based cloning. The *CaqDYI(P/H)1.1* QTL genomic region from the donor lines with low (L) and high (H) DYI(P/H) were back-crossed six times into the genetic backgrounds of their corresponding recurrent drought-tolerant and -sensitive lines to generate two BC<sub>6</sub>F<sub>3</sub> NILs, LDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup> and HDYI(P/ H)- $NIL^{CaqDYI(P/H)1.1}$ , respectively, exhibiting approximately 92%-95% recovery of the recurrent parental genome (Figure 2C; Supplemental Figures 11 and 12). Using 380 mapping individuals of an F2 population developed by intercrossing these contrasting NILs [LDYI(P/H)- $NIL^{CaqDYI(P/H)1.1} \times HDYI(P/H)-NIL^{CaqDYI(P/H)1.1}$ ], 32 recombinants were detected between Ca1:12707104(T/C) (39.0 cM, 12,707,104 bp) and Ca1:12713382(G/C) (39.7 cM, 12,713,382 bp) SNPs at a 6.3-kb CaqDYI(P/H)1.1 QTL genomic interval (Figure 2, C-D). The 6.3-kb QTL interval was narrowed down to a 4.4-kb genomic region in eight promising recombinant lines of the NILs by comprehensive phenotyping following progeny testing of all 32 recombinants (Figure 2E). Structural and functional annotation of this 4.4-kb CaqDYI(P/H)1.1 QTL genomic interval using the kabuli reference chickpea genome identified only a single bHLH TF gene. A comprehensive genome-wide survey of bHLH genes annotated from the chickpea genome based on characteristics of their encoded bHLH domains detected 135 bHLH genes. Of which, the bHLH with an MYC-type functional domain delineated in a CaqDYI(P/H)1.1 major QTL genomic region was encoded as a CabHLH10 (gene accession ID Ca\_02482) (Supplemental Figure 13A; Supplemental Table 7). Two URR-SNPs tightly linked to the delineated CabHLH10 (Figure 2E), as indicated by the lack of recombination between these target gene loci, were selected as the potential candidate governing yield under drought stress in chickpea. Summarily, two informative SNPs [Ca1:12709839(T/A) and Ca1:12709928(G/ T)] in the URR of a CabHLH10 tightly linked to a major and robust CaqDYI(P/H)1.1 QTL modulating droughttolerance traits that contribute to enhanced yield/productivity in chickpea were delineated based on highresolution QTL/fine mapping and GWAS as well as gene-by-gene regional association analysis. The genomic constitution and comprehensive phylogenetic analysis of CabHLH10 gene orthologs annotated from genomes of diverse legumes and Arabidopsis inferred the high conservation of bHLH domains encoded by this gene across legumes and Arabidopsis (Supplemental Figure 13, B-D; Supplemental Table 8).

# Superior haplotype of *CabHLH10* governs enhanced yield under drought stress in chickpea

We performed molecular haplotyping of the entire coding and non-coding regions of a CabHLH10 (7561-bp) via targeted resequencing in 222 ILs, six parental accessions of the ILs, 86 cultivated desi, kabuli and 81 wild Cicer accessions (Supplemental Tables 1 and 9 and 10). This analysis detected 63 SNPs in CabHLH10, including two synonymous coding- and 28 URR-SNPs (Figure 3A). Further, molecular haplotyping of CabHLH10 showed that all identified 63 SNPs including 28 URR-SNPs were coinherited together as haplotype-blocks that overall constituted two major haplotypes (HAP A and HAP B) in the ILs/ accessions used (Figure 3, A-B). No amino acid change in the coding region was observed between two CabHLH10 gene haplotypes, HAP A and HAP B. Gene haplotype-based association analysis revealed a significant association of haplotypes with yield traits under irrigated unstressed versus unirrigated drought stress conditions across all three individual and over all environments. Especially, HAP A and HAP B were significantly associated with low [LDYI(P/H)] and high [HDYI(P/H)] DYI, respectively (Figure 3, C-E). A higher frequency of HAP B compared



Figure 2 High-resolution molecular mapping and map-based cloning identified a major quantitative trait locus (QTL) genomic region of a CabHLH10 governing drought tolerance in chickpea. A, Genetic mapping of a major QTL [CaqDYI(P/H)1.1] on chromosome 1 of a high-density linkage map using 190 mapping individuals of a RIL population [LDYI(P/H)-IL77 × HDYI(P/H)-IL105]. B, High-resolution QTL mapping depicts the LOD score distribution plots of reaction norms using SNP allele-specific order across years. The dashed line represents the LOD cut-off score of 7.0, permutation P < 0.001. Red reaction norm plots indicate [HDYI(P/H)]-specific allele derived from the RIL mapping parental IL [HDYI(P/H)-IL105]. The SNP genotyping and DYI(P/ H) trait phenotyping information evaluated among RILs were analyzed under both irrigated (unstressed) and unirrigated (drought stress) conditions by three individual years and using the overall mean across three years (over all years) to generate the reaction norms plots. C1-C8: Chromosomes 1-8 of chickpea. C, Fine-mapping of the CaqDYI(P/H)1.1 using a mapping population [LDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup> × HDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup>] of 380 F<sub>2</sub> individuals with contrasting DYI(P/H) trait. D, The subsequent integration of the genetic and physical map of the fine-mapped target genomic region harboring the CaqDYI(P/H)1.1 scaled down a 77.5-kb (1.7 cM) QTL interval into a 6.3-kb genomic region with two protein-coding genes including a bHLH transcription factor (CabHLH10) on chromosome 1. The genetic (cM)/physical (bp) distance and identity of the markers mapped on the LGs/ chromosomes are indicated at the lower and upper sides of the chromosomes, respectively. The SNPs flanking and tightly linked with CaqDYI(P/H)1.1 and CabHLH10 mapped on chromosome 1, are indicated by blue and red fonts, respectively. E, Progeny testing to deduce the genotype and multi-years replicated field phenotypes of 32 selected recombinants and mapping parental ILs [LDYI(P/H)-IL77 and HDYI(P/H)-IL105] as well as QTL-introgressed NILs [LDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup> and HDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup>] for the DYI(P/H) trait. This further narrowed down a 6.3-kb QTL interval into a 4.4-kb genomic region in the eight most promising recombinants of NILs. At this QTL genomic interval, two upstream regulatory region (URR)-derived SNPs [Ca01:12709839(T/A) and Ca01:12709928(G/C)] tightly linked to a CabHLH10, demonstrating zero recombination with these target loci in eight selected recombinants of NILs were associated strongly with DYI(P/H) trait. The genomic constitution of high- [HDYI(P/H)] and -low [LDYI(P/H)] DYI(P/H) lines are denoted by "A" and "B," respectively. Horizontal error bars represent mean ± standard deviation (n = 5 to 8, independent plants of each IL/NIL), \*Significant difference between HDYI(P/H) and LDYI(P/H) at a P < 0.001, Student's t-test. ILs: Introgression lines. LDYI(P/H) and HDYI(P/H): low and high drought yield index per plant/hectare, respectively. LOD: logarithm of odds.

with HAP A was shared in the parents of ILs (71.5%) followed by wild *Cicer* accessions (69.2%), ILs (61.8%), and cultivated chickpea accessions (53.5%) (Figure 3 B). These findings implicate that the target genomic region (*CabHLH10* gene haplotype/allele) delineated using the wild and cultivated gene pool-derived ILs has a functional relevance to develop drought-tolerant chickpea cultivars with enhanced yield/productivity.



Figure 3 Superior natural haplotype of a CabHLH10 transcription factor gene associated with drought tolerance, exhibit enhanced transcriptional activity/ expression in the drought-tolerant lines. A-E, Gene haplotype-specific trait association mapping of CabHLH10 in chickpea. A, Genomic organization and constitution of CabHLH10 showing the distribution of 63 SNPs in different coding and non-coding sequence components of the gene. CDS: Coding sequence, URR/DRR: Upstream/downstream regulatory region, FD: Functional domain. B, The genotyping of 28 SNPs in the upstream regulatory region (URR) of a CabHLH10 among 222 introgression lines (ILs) and seven accessions (used as parents to develop the ILs) as well as 86 cultivated desi and kabuli accessions and 81 wild Cicer accessions constituted two major haplotypes. C-E, Boxplots depicting the phenotypic variation for YP, YH, DYI(P) and DYI(H) traits in the said 222 ILs (association panel) represented by two haplotypes, HAP A and HAP B, demonstrating their significant association with low [LDYI(P/ H)] and high [HDYI(P/H)] DYI, respectively. Box edges represent the upper and lower quantiles, with median values in the middle of the box. In Boxplots, Midline: Median; Box: Interquartile range (IQR) with box limits indicated by lower and upper quartiles of 25th and 75th percentiles, respectively; Whiskers: Minimal and maximal whisker data-points within 1.5-times of IQR from the first and third quartile, respectively. Digits in square brackets denote the number of ILs representing each class of haplotype associated with DYI. The YP, YH, DYI(P), and DYI(H) traits were evaluated in 222 ILs under both irrigated (IR) (unstressed) and unirrigated (UIR) (drought stress) conditions across all three years (over all years). \*P < 0.001; Significant differences among unstressed and drought-stressed ILs belonging to individual haplotypes (HAP A and HAP B) estimated by one-way ANOVA and two-sided Wilcoxon test. F, Differential expression profile of low and high DYI(P/H)-associated CabHLH10 gene haplotypes in the vegetative (root, shoot, and leaf) and reproductive (flower, pod, and seed) tissues of the corresponding haplotype-introgressed homozygous [LDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup> and HDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup>] and hetero-zygous [LDYI(P/H)-NIL<sup>CabHLH10(HAPA)(HAPB)</sup> and HDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup>] NILs and parental ILs [LDYI(P/H)-IL77 and HDYI(P/H)-IL105]. a, b represents the significant difference in expression level of gene haplotypes in HDYI(P/H) as compared to LDYI(P/H) NILs/ILs. Vertical error bars represent the mean  $\pm$  standard deviation (n = 3, three independent biological replicates of each line and three technical replicates of each biological replicate). \*Significant difference of expression level of gene haplotypes in the aforesaid vegetative tissues as compared to reproductive tissues at P  $\leq$  0.001, estimated by Student's t-test. x- and y-axes indicate vegetative and reproductive tissues of NILs/ILs and relative expression level, respectively. C-F, Two-way ANOVA was performed with Genotype (G) and drought stress Treatment (T) as the two factors, and G  $\times$  T as the Genotype and Treatment interaction. G: P < 0.001, T: P < 0.001 and G × T: P < 0.01. NS: Non-significant. G, Histochemical GUS staining of two weeks old CabHLH10pro::GUS transgenic chickpea plants showing organ-specific GUS signals in different tissues of I) roots, II) shoots, and III) leaves. H, Transient expression assay to determine the effects of low (HAP A) and high (HAP B) DYI(P/H) haplotypes constituted by the regulatory SNPs from the URR of a CabHLH10 on its expression in the corresponding haplotypes-introgressed NILs. Left; the construct backbone with URR-SNP haplotypes (HAP A and HAP B) influencing the expression of their corresponding promoter-driven GUS ( $\beta$ -glucuronidase) reporter gene (CaMV 35S promoter as a control) regulating the expression of the GFP (green fluorescent protein used for normalization of transformation efficiency) reporter gene. Right; \*Significant difference of GUS expression level in the chickpea leaves of HDYI(P/H)-NIL<sup>CabHLH10(HAPB)</sup> relative to LDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup> transformed with corresponding URR-SNP haplotypes at  $P \le 0.001$ , estimated by Student's t-test. Horizontal error bars represent the mean  $\pm$  standard deviation (n = 3). HAP: haplotype, LDYI(P/H) and HDYI(P/H): low and high drought yield index per plant/hectare.

# Marker (haplotype)-assisted selection develops CabHLH10 haplotype-introgressed DYI-NILs

We investigated the role of CabHLH10 gene-derived haplotypes (HAP A and HAP B) in controlling yield/productivity traits under drought stress, i.e. DYI(P/H) by developing LDYI(P/H)-NIL<sup>CabHLH10[HAPA]</sup> haplotype-introgressed and HDYI(P/H)-NIL<sup>CabHLH10[HAPB]</sup> NILs in chickpea. To accomplish this, haplotype-assisted foreground selection was performed using the SNPs linked/flanking to HAP A and HAP B haplotypes of a CabHLH10 in the CaaDYI(P/H)1.1 major QTL genomic region. Further, we chose a set of 1536 genome-wide SNPs that mapped uniformly on eight chromosomes among 26 positive recombinants (as identified by foreground selection) to perform subsequent genotyping and haplotype-assisted background selection across each of the advance generation back-cross mapping population until  $BC_6F_3$ . Finally, we specifically developed HAP A and HAP B haplotype-introgressed four LDYI(P/H)-NIL<sup>CabHLH10[HAPA]</sup> and three HDYI(P/ H)-NIL<sup>CabHLH10[HAPB]</sup> NILs, respectively, with enhanced recovery of the parental recurrent genome (up to 98.8%–99.7%) by marker (haplotype)-assisted foreground and background selection (Supplemental Figures 11 and 12). Comprehensive phenotypic evaluation and characterization of the LDYI(P/ H)- and HDYI(P/H)-NILs was performed using the soil cylinder culture (rainout shelter) under control unstressed and drought stress conditions to determine their agro-morphological responses towards drought. The HDYI(P/H)-NILs compared to LDYI(P/H)-NILs exhibited enhanced root biomass, including increased taproot length, primary lateral root number, and root surface area, with only a reduced (non-significant) yield penalty of fresh shoot weight (g), flower and pod number, and leaf branch number under drought stress (Figure 4, A-J; Supplemental Table 11). Histology-based morphometric measurements of the DYI-NILs (with five independent biological/ technical replicates) revealed an overall decrease ( $\sim$ 2.5-fold) in root cross-sectional area (RXSA) and total cortex area (TCA) and an increase ( $\sim$ 2.5-fold) in total stele area (TSA) and metaxylem area (MXVA) in the drought-stress imposed root tissues of the HDYI(P/H)-NILs/ILs compared to their counterpart LDYI(P/H)-NILs/ILs (Figure 5, A-C). Overall decrease in RXSA and TCA with an increase in TSA and MXVA in the drought stress-imposed root tissues of HDYI- and LDYI-NILs/ILs is considered to be a common adaptation mechanism in response to drought (Prince et al., 2017). Increased TSA and MXVA have been reported to improve stomatal conductance, internal CO<sub>2</sub> capture, root hydraulic conductivity and water uptake, resulting in normal maintenance of shoot and root physiological processes as well as yield protection during drought stress in soybean and wheat (Kadam et al., 2015; Prince et al., 2017). Root morphological, physiological, and anatomical features are considered as the most important traits which have been phenotypically well-characterized, and further manipulated as well as optimized widely to demonstrate their potential to enhance crop yield and productivity in water-limited environments in many cereal (Zhu et al.,

2010; Saengwilai et al., 2014; Kadam et al., 2015) and legume (Peña-Valdivia et al., 2010; Ramamoorthy et al., 2013; Prince et al., 2017) crops. These results overall infer that superior *CabHLH10* gene-derived haplotype (HAP B) has proficiency to enhance yield under drought stress in chickpea.

# Enhanced transcriptional activity of a superior *CabHLH10* haplotype in DYI-NILs

To determine the functional importance of CabHLH10 gene haplotypes (HAP A and HAP B), haplotype-specific differential expression profiling was performed in various vegetative and reproductive tissues of homozygous as well as heterozygous LDYI(P/H)- and HDYI(P/H)-NILs using the reverse transcription quantitative PCR (RT-qPCR) assay. Haplotype-specific expression profiling exhibited a pronounced expression (at least 8-fold up-regulation) of CabHLH10 transcripts from both haplotypes (HAP A and HAP B) in the root, shoot, and leaf compared to flower, pod, and seed of homozygous and heterozygous DYI-NILs (Figure 3F). Interestingly, transcript from superior CabHLH10 haplotype (HAP B) showed a higher expression (at least 2.5-fold upregulation) in the root, shoot and leaf of homozygous HDYI(P/H)-NIL CabHLH10[HAPB] compared to homozygous LDYI(P/H)-NIL<sup>CabHLH10[HAPA]</sup>. However, no such significant difference in expression level was observed between heterozygous HDYI(P/H)-NIL<sup>CabHLH10[HAPA][HAPB]</sup> and LDYI(P/H)-NIL<sup>CabHLH10[HAPA][HAPB]</sup>. To unravel the tissuespecific localization of CabHLH10, in planta promoter activity of this gene was investigated in the transgenic chickpea plants carrying CabHLH10pro:GUS construct, whereby the putative promoter of the CabHLH10 was used to direct the expression of the  $\beta$ -glucuronidase (GUS) reporter gene. GUS staining of the transgenic chickpea plants (two weeks old) exhibited higher GUS activity in the root compared to shoot and leaf (Figure 3 G). Further, we performed a transient GUS expression assay in chickpea leaves through agroinfiltration of constructscontaining haplotype (HAP A and HAP B)-specific URR fragments, amplified from the corresponding homozygous HDYI(P/H)-NIL<sup>CabHLH10[HAPB]</sup> and LDYI(P/ H)-NIL<sup>CabHLH10[HAPA]</sup>, upstream of the GUS gene. GUS transcript level was significantly higher in the leaf harboring HAP B versus HAP A haplotypes in their URRs (Figure 3H), pointing to a positive correlation between promoter functionality enhanced CabHLH10 transcript accumulation and (Figure 3, F–H). These findings further suggest that superior CabHLH10 haplotype (HAP B) is transcriptionally more active compared to haplotype HAP A in the DYI(P/H)-NILs, possibly leading to enhanced yield/productivity during drought stress.

# CabHLH10 transcriptionally regulates a known ABA-dependent drought-responsive gene, CaRD22, via a trans-eQTL

ABA is a major plant hormone that plays a vital role in plant response and tolerance to drought stress by modulating the



**Figure 4** Field phenotyping demonstrated enhanced root physiological trait characteristics without compensating shoot growth/development in the drought-tolerant *CabHLH10* gene haplotype-introgressed lines during drought stress. A–C, Agro-morphological trait-based phenotyping of the roots and shoots of 45–60 days-old cylinder-soil-grown plants of high [HDYI(P/H)-NIL<sup>*CabHLH10*(HAPB)</sup>] and low [LDYI(P/H)-NIL<sup>*CabHLH10*(HAPA)</sup>] DYI-NILs evaluated at a rainout shelter under control unstressed (US) and drought stress (DS) conditions. D–J, Phenotypic variation for root and shoot agro-morphological traits including (D) taproot length (cm), (E) lateral root number, (F) root surface area (cm<sup>2</sup>), (G) root volume (cm<sup>3</sup>), (H) fresh shoot weight (g), (I) flower and pod number, and (J) leaf branch number in both low and high DYI(P/H) NILs. Significant difference in said root/shoot morphometric trait characteristics between HDYI(P/H)-NIL and LDYI(P/H)-NIL under US (a) versus DS (b) (*P* < 0.001, two-tailed *t*-test). Significant difference in root/shoot morphometric trait features during DS compared to US HDYI(P/H)-NIL (c) and LDYI(P/H)-NIL (d) (*P* < 0.001, two-tailed *t*-test). Vertical error bars represent the mean  $\pm$  standard deviation (*n* = 3, 3 independent plants per NIL). Two-way ANOVA was performed with Genotype (G) and DS Treatment (T) as the two factors, and G × T as the Genotype and Treatment interaction. G: *P* < 0.001, T: *P* < 0.001 and G × T: *P* < 0.01. F: Flowers/pods grown in each NIL. NS: Non-significant. HAP: haplotype; LDYI(P/H) and HDYI(P/H): low and high drought yield index per plant/hectare. Scale bars: 1 cm. NIL: near isogenic line. The shoot (B) and root (C) images are from the same samples as depicted in (A).

expression of a cascades of drought- and ABA-responsive genes via ABA signalling (Abe et al., 2003). The expression of one such vital dehydration-responsive gene *RD22* (responsive to desiccation22) is also induced by ABA (Abe et al., 1997, 2003). A *MYC2*-type *bHLH* TF gene delineated in this study which is primarily known to be induced by ABA, binds to the *cis*-regulatory G-box elements and its variants on the promoter of a *RD22* gene and subsequently, induces its ABA-dependent drought response for imparting tolerance in crop plants (Abe et al., 1997, 2003; Shinozaki and Shinozaki, 2006, 2007; Dombrecht et al., 2007; Kazan and Manners, 2013). In this perspective, eQTL mapping was performed by integrating the differential expression profile of a known ABA-dependent drought-responsive gene, CaRD22 during drought stress with the genotyping information of SNPs genetically mapped on chromosomes in an aforesaid population [LDYI(P/H)-IL77 × HDYI(P/ RIL mapping H)-IL105] with contrasting DYI(P/H) traits. This analysis identified a major significant (LOD > 22.2) trans-eQTL [CaeqDYI(P/H)1.1] for a CaRD22 gene which spans 2.8 kb genomic interval [12707104 bp (39.0 cM)-12709928 bp (39.5 cM)] on chromosome 1 (Supplemental Figure 14). The CaRD22 gene (chromosome 4) was thus not congruent with its corresponding major eQTL (chromosome 1) in accordance with their mapped positions on chromosomes. This major eQTL for a CaRD22 explained a total of 39.7%



**Figure 5** Histology-based phenotypic evaluation and characterization demonstrated improved root morphometric trait characteristics in the drought-tolerant *CabHLH10* gene haplotype-introgressed lines during drought stress. A, Microanatomical phenotyping and morphometric trait measurement of the unstressed (US) and drought-stressed (DS, 12 h moisture stress) root tissues of 20-days-old pot-soil-grown plants of high  $[HDYI(P/H)-NIL^{CabHLH10(HAPB)}]$  and low  $[LDYI(P/H)-NIL^{CabHLH10(HAPA)}]$  DYI-NILs and parental ILs [HDYI(P/H)-IL105 and LDYI(P/H)-IL77] at the vegetative stage. RXSA: root cross-sectional area; TCA: total cortex area, TSA: total stele area; MXVA: metaxylem vessel area (shown in B). Scale bars: 100 µm. C, Relative fold change of the four morphometric root characteristics in drought-stressed compared to unstressed root tissues of aforesaid high/low DYI-NILs and parental ILs. Decreases and increases in area w.r.t. control are denoted by "D" and "I," respectively. All lines were grown and phenotyped with at least five biological replicates under unstressed and drought stress conditions in a controlled environment. Error bars represent the mean  $\pm$  standard deviation for each sample with five independent replicates (n = 5). a, b: Significant difference in HDYI w.r.t. LDYI (P < 0.001, two-tailed *t*-test). Two-way ANOVA was performed with Genotype (G) and drought stress Treatment (T) as the two factors, and G  $\times$  T as the Genotype and Treatment interaction. G: P < 0.001, T: P < 0.001 and  $G \times$  T: P < 0.01. HAP: haplotype. L/HDYI(P/H): low/high drought yield index per plant/hectare. NIL: near isogenic line.

variation in the expression of this gene for drought tolerance. Interestingly, the eQTL of said *CaRD22* gene was found to harbor a promising strong DYI(P/H) trait-associated *CabHLH10* gene (delineated in this study) on the chromosome 1 (Supplemental Figure 14) and thus both of these genes were found to be *trans*-regulated for controlling drought tolerance in chickpea. We reasoned that *CabHLH10* might physically binds to *cis*-regulatory elements in the promoter of *CaRD22*, which harbors the *trans*-eQTL, thereby inducing ABA-dependent drought tolerance in chickpea.

To test this hypothesis, we performed yeast one-hybrid assay and electrophoretic mobility shift assay (EMSA) and observed that *CabHLH10* binds specifically to three tandem repeats of a *cis*-regulatory G-box variant (CACGTG) in the promoter region of *CaRD22* (Figure 6, A–C). However, *CabHLH10* failed to bind into the created mutated form (TTCGAC) of this G-box element (Figure 6, A–C). Further, chromatin immunoprecipitation (CHIP)-based qPCR assay validated more prominent/efficient binding (16-fold enrichment relative to control IgG) of *CabHLH10* to the aforementioned G-box elements in both HDYI(P/H)- and LDYI(P/H)-NILs (Figure 6, A and D). An *Arabidopsis thaliana* protoplast-based transient transactivation assay revealed that 35S:*CabHLH10* increased the expression (1.9-fold luciferase activity compared to control) of *CaRD22:LUC* (Figure 6, E and F). These findings indicate that *CabHLH10* transcriptionally regulate *CaRD22* via sequence-specific



Figure 6 Nucleus-localized CabHLH10 interacts and transcriptionally regulates CaRD22, a known drought-responsive gene, to confer drought tolerance in chickpea. A, Schematic diagram of the genomic structural organization of CaRD22. The positions of forward and reverse PCR primers (P1 and P2) used for ChIP-qPCR analysis of CaRD22 are indicated. Genomic DNA region (a) with the conserved G-box regions in the promoter (upstream regulatory region) of CaRD22 used for yeast one-hybrid assay and electrophoretic mobility shift assay (EMSA) is indicated by a pink rectangle box. B, Interaction of CabHLH10 with G-box element in the CaRD22 promoter through yeast one-hybrid assay. Dilutions of transformed yeast cells were grown on different amino acid-deficient SD media with gradient 3-AT concentration. Growth of yeast cells cotransformed with pHIS2.1 vector consisting of G-box promoter element (pHis-pro\_CaRD22) and pGADT7 vector consisting of CabHLH10 (pGADT7-CabHLH10) on selective medium indicates binding of CabHLH10 with the CaRD22 promoter. The CabHLH10 is unable to bind to the mutated form of the G-box created in the CaRD22 promoter (pro CaRD22 Mut). C, EMSA showing interaction of CabHLH10 with G-box cis-regulatory elements in the CaRD22 promoter. Biotin-labeled oligonucleotide probes from promoter elements displayed binding with GST-CabHLH10, while use of unlabeled probes competitively reduced labeled probe binding. Oligonucleotide probes from mutated G-box elements could not bind with GST-CabHLH10 and similarly GST alone could not bind to the promoter elements. D, ChIP-qPCR assay exhibiting binding of CabHLH10 to the G-box element in the promoter of CaRD22 in vivo. Immunoprecipitation was performed with anti-CabHLH10 antibody. Immunoprecipitated chromatin was analyzed by RT-qPCR using primers indicated in (A). RT-qPCR enrichment was measured by normalizing to IgG = 1 and to the total input of each sample. Error bars represent the mean  $\pm$  standard deviation for each sample with 3 independent replicates (n = 3). \*Significance of LDYI(P/H) and HDYI(P/H) NILs as compared to internal control IgG in ChIP-qPCR assay (P < 0.01, two-tailed t-test). NIL: near isogenic line. NS: non-significant (E) Schematics depicting the effector and reporter plasmids used for the transient assay in Arabidopsis protoplasts. REN, Renilla luciferase; LUC, firefly luciferase. F, The relative LUC activity expressed by a reporter CaRD22Pro:LUC along with control (empty vector) or 35S:CabHLH10 effector. Error bars represent the mean ± standard deviation for each sample with 3 independent replicates (n = 3). \*Significant difference of LUC activity of CabHLH10 as compared to control at  $P \le 0.01$  estimated by a two-tailed *t*-test. HAP: haplotype; L/HDYI(P/H): low/high drought yield index per plant/hectare. G, Sub-cellular localization of CabHLH10. Confocal microscopy images showing the localization of YFP-CabHLH10 (upper panel) and YFP alone (lower panel) which are transiently expressed in onion epidermal cells (under 2x CaMV35S promoter) through particle gun bombardment. DAPI (4',6-diamidino-2-phenylindole) was used to stain the nuclei. Scale bars = 50  $\mu$ m.

binding to the G-box *cis*-elements in its promoter region to confer ABA-responsive drought tolerance in chickpea. In onion epidermal cells harboring a 35S:YFP-CabHLH10 construct, CabHLH10 was observed to be localized in the cytoplasm and the nucleus just like YFP control (Figure 6 G).

The nuclear localization of *CabHLH10* further strengthens the conclusion that it is involved in transcriptional control of *CaRD22*. Overall, these findings highlight the roles of the genetic and physical interactions, as well as the transcriptional interplay, of *trans*-eQTLs in regulating *CaRD22* and *CabHLH10* expression to control drought tolerance possibly via ABA signaling in chickpea.

# *CabHLH10* induces drought tolerance by modulating ABA signaling

We explored whether drought and ABA stress is required for inducing CabHLH10 leading to further CaRD22-mediated ABA-responsive drought tolerance in chickpea. For this, we primarily performed differential gene/haplotype-specific expression profiling of CabHLH10 and CaRD22 in the homozygous as well as heterozygous HDYI(P/H)- and LDYI(P/H)-NILs harboring CabHLH10 haplotype introgression under unstressed (control), drought stress (12 h moisture stress), and exogenous ABA treatment (100  $\mu$ M) conditions. Differential expression profiling using the RT-qPCR assay revealed higher expression of CabHLH10 and CaRD22 in both drought-stress and ABA-treated root and shoot compared to that of unstressed homozygous HDYI(P/H)-NILs as well as heterozygous HDYI(P/H)and LDYI(P/H)-NILs. Remarkably, the enhanced expression of CabHLH10 (at least 4.1-fold upregulation) and CaRD22 (at least 4.2-fold upregulation) in the unstressed as well as the drought- and ABA-stress-imposed root and shoot of homozygous HDYI(P/H)-NIL<sup>CabHLH10[HAPB]</sup> compared to homozygous LDYI(P/H)-NIL<sup>CabHLH10[HAPA]</sup> was observed (Figure 7, A and B). We also observed enhanced expression of both CabHLH10 and CaRD22 under drought stress compared to unstressed homozygous NILs. However, no significant difference in the expression level of CabHLH10 and CaRD22 was obtained in the root and shoot between heterozygous HDYI(P/H)-NIL<sup>CabHLH10[HAPA][HAPB]</sup> and LDYI(P/ H)-NIL<sup>CabHLH10[HAPA][HAPB]</sup> during drought- and ABA-stress (Figure 7, A and B). Global transcriptome profiling based on whole-genome transcriptome sequencing also revealed the upregulation of known/candidate genes underlying the ABA-responsive pathway in HDYI(P/H)-NILs versus LDYI(P/ H)-NILs, especially in the root and shoot under droughtand ABA-stress (Figure 7 C; Supplemental Table 12). We further evaluated various agro-morphological traits of the HDYI(P/H)- and LDYI(P/H)-NILs using hydroponic, pot-soil, and phytagel medium (supplemented with/without 100  $\mu$ M ABA) under controlled environment along with their estimated ABA content during drought and ABA stress. Agro-morphological evaluation revealed significant increase in root volume, with only a reduced (non-significant) yield penalty of fresh shoot weight in the HDYI(P/H)-NILs compared to LDYI(P/H)-NILs under drought- and ABA-stress (Figure 4, A–J; Supplemental Figure 15). Interestingly, ABA levels were also higher (at least 2.0-times) in the root and shoot of HDYI(P/H)-NILs compared to LDYI(P/H)-NILs under drought and ABA stress, indicating possible feedback of CabHLH10 and CaRD22 better equipping the plants for stress sensing (Figure 7 D). These observations overall indicate that ABA modulates CaRD22-mediated drought tolerance through CabHLH10 regulation.

# *CabHLH10* transcriptionally activates yield-enhancing PE genes to confer higher yield/ productivity during drought

We compared the effects of CabHLH10 gene haplotypes on various seed yield component traits in HDYI(P/H)- versus LDYI(P/H)-NILs across multiple environments in the field under both unstressed and drought-stress conditions (Supplemental Table 13). Six high-yielding Indian desi and kabuli cultivated chickpea varieties and one wild progenitor, Cicer reticulatum accession used as parents to develop ILs, were also included in the analysis (Supplemental Table 1). HDYI(P/H)-NILs containing introgression of the superior CabHLH10 gene haplotype (HAP B) exhibited many desirable seed yield attributes compared to the other lines, including higher yield per plant and yield per hectare (productivity) under both unstressed and drought-stress conditions, i.e. enhanced DYI(P/H) across all environments examined without compromising any desirable agronomic performance (Supplemental Figure 16; Supplemental Table 13).

We further performed a phenotypic evaluation of droughtand ABA-stress imposed HDYI(P/H)- versus LDYI(P/H)-NILs for major PE parameters that contribute to enhanced seed yield: chlorophyll content (CC; mg/g-FW), SPAD chlorophyll meter reading (SCMR), chlorophyll fluorescence (CF; Fv/Fm), CO<sub>2</sub> assimilation rate at increasing CO<sub>2</sub> concentration (CAR-CO<sub>2</sub> $\uparrow$ ; µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>), and CO<sub>2</sub> assimilation rate at increasing light intensity (CAR-LI<sup> $\uparrow$ </sup>; µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>). The HDYI(P/H)-NILs with improved root and shoot biomass had increased aforesaid PE parameters compared to their LDYI(P/ H)-NILs counterparts during drought/ABA stress (Figure 8, A and B). The increased PE corresponded well with the upregulated expression of 16 previously reported (Basu et al., 2019) yield-enhancing PE-related chickpea genes in the drought/ ABA-stress imposed HDYI(P/H)- versus LDYI(P/H)-NILs (Figure 8 C). Two strong yield-enhancing PE-associated genes encoding chlorophyll a/b-binding (CaCAB) protein and a basic leucine zipper (CabZIP) TF were strongly upregulated (at least 10-fold) in the HDYI(P/H)-NILs, especially under drought/ABA stress. A ChIP-based RT-qPCR assay further confirmed the notion that CabHLH10 modulates the expression of two said strong PE-associated genes by specifically binding to the G-box cis-regulatory elements (CACATG) in their promoters (Figure 8, D-G). Besides, a major trans-eQTL [CaeqDYI(P/H) 1.1] genomic region identified for two PE genes, CaCAB and CabZIP was found to harbor a strong DYI(P/H) trait-regulating CabHLH10 TF delineated in this study and which further showed correspondence to an eQTL region detected for CaRD22 on chromosome 1 (Supplemental Figure 14). This finding implies that CabHLH10 activates the transcription of two strong yield-enhancing PE genes to increase efficiency of photosynthesis during drought stress in chickpea. We conclude that CabHLH10 improves survival during drought stress as well as enhances yield/productivity of chickpea by modulating transcriptional regulation of CaRD22 and PE genes in response to ABA signaling.





Figure 7 CabHLH10 enhances drought tolerance by modulating transcriptional regulation of CaRD22 in response to ABA signaling genes in chickpea. Differential expression profile of CabHLH10 gene haplotypes (A) and its downstream dehydration-responsive gene CaRD22 (B) in the control (unstressed) as well as drought (12 h moisture stress) and ABA (100 µM ABA) stress-imposed root and shoot tissues (20-d-old pot-soil-grown plants at the vegetative stage) of high and low DYI CabHLH10 gene haplotype-introgressed homozygous [LDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup> and HDYI(P/ H)-NIL<sup>CabHLH10(HAPB)</sup>] and heterozygous [LDYI(P/H)-NIL<sup>CabHLH10(HAPA)(HAPB)</sup> and HDYI(P/H)-NIL<sup>CabHLH10(HAPA)(HAPB)</sup>] NILs and parental ILs [LDYI(P/H)-IL77 and HDYI(P/H)-IL105]. Two-way ANOVA was performed with Genotype (G) and drought stress Treatment (T) as the two factors, and G  $\times$  T as the Genotype and Treatment interaction. G: P < 0.001, T: P < 0.001 and G  $\times$  T: P < 0.01. a-f and g-j: significant difference of CabHLH10 gene haplotype expression in the drought/ABA-stress imposed shoots and roots, respectively, of high and low DYI-NILs/ILs as compared to its corresponding control unstressed tissues analyzed (P < 0.001, two-tailed t-test). Error bars represent the mean  $\pm$  standard deviation for each sample with 3 independent replicates (n = 3).  $\alpha$ ,  $\beta$ : Significant difference in gene haplotype expression in the drought/ABA stress-imposed shoots and roots of HDYI w.r.t. LDYI (P < 0.001, two-tailed t-test). S-C/S-ABA/S-D: Shoot-control/shoot-ABA/shoot-drought, respectively. R-C/R-ABA/R-D: Root-control, root-ABA, root-drought, respectively. NIL: near isogenic line. IL: introgression line. NS: non-significant. x- and y-axes indicate the unstressed and drought/ABA stress-imposed root and shoot tissues of NILs/ILs and relative gene expression level, respectively. C, Differential expression profile of ABA-responsive known/candidate genes controlling drought tolerance in crop plants assayed through global transcriptome profiling of aforesaid (A, B) unstressed and drought/ABA-treated root and shoot tissues of homozygous NILs. The green, black, and red color scale at the bottom represents low, medium, and high levels of average normalized log<sub>2</sub> signal expression value of genes in different tissues, respectively. The accessions/ tissues and genes selected for expression profiling are indicated on right and upper part of expression map, respectively. Detailed information about the ABA-responsive genes is provided in Supplemental Table 12. D, Variation in ABA content (nmol) measured in 1 g fresh weight (FW) of aforementioned (A, B) unstressed and drought/ABA-stress imposed root and shoot tissues of homozygous NILs and parental ILs. a-d, e-h and i-l represent statistical significance in drought/ABA-stress imposed shoots and roots, respectively of NILs/ILs w.r.t. unstressed control (P < 0.001, two-tailed t-test). Error bars represent the mean  $\pm$  standard deviation for each sample with 3 independent replicates (n = 3).  $\alpha$ ,  $\beta$ : Significance in HDYI w.r.t. LDYI (P < 0.001, two-tailed t-test). \*Significance in shoots w.r.t. roots (P < 0.001, two-tailed t-test). HAP: haplotype. L/HDYI(P/H): low/high drought yield index per plant/hectare.

Overexpression of CabHLH10 enhanced drought tolerance in chickpea and Arabidopsis transgenics by improving root and shoot agro-morphological traits As previously described, introgression of a superior haplotype of CabHLH10 into the ILs by haplotype-assisted selection improved root and shoot biomass and PE, consequently increasing its yield and productivity during drought without compromising its agronomic performance. To further investigate and gain more insights into the role of *CabHLH10* for drought tolerance, we generated *CabHLH10*-overexpressing (35S:*CabHLH10*) transgenic chickpea and *Arabidopsis* plants. Significant increase in root biomass ( $\geq$  2-fold), taproot length



Figure 8 CabHLH10 enhances seed yield and productivity by modulating transcriptional regulation of genes associated with high PE in chickpea. A-B, Bar plots illustrating the phenotypic variation for diverse PE trait parameters, including (A) CC (mg/g-FW) and CF (Fv/Fm), as well as (B) SPAD chlorophyll meter readings (SCMR), CO<sub>2</sub> assimilation rate at increasing CO<sub>2</sub> concentration (CAR-CO<sub>2</sub> $\uparrow$ ; µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>), and CO<sub>2</sub> assimilation rate at increasing light intensity (CAR-LI<sup> $\uparrow$ </sup>; µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>) under the unstressed control [C] as well as drought [D] and ABA stress-imposed high [HDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup>] and low [LDYI(P/H)-NIL<sup>CabHLH10(HAPA)</sup>] DYI CabHLH10 gene haplotype-introgressed NILs. Vertical error bars indicate standard deviation with 3 biological replicates (n = 3). Two-way ANOVA was performed with Genotype (G) and drought stress Treatment (T) as the two factors, and  $G \times T$  as the Genotype and Treatment interaction. G: P < 0.001, T: P < 0.001 and  $G \times T$ : P < 0.01. a, b, c: significance in HDYI w.r.t. LDYI under the unstressed control, drought and ABA stress (P < 0.001, two-tailed t-test). C, Differential expression profile of 16 yield-enhancing PE chickpea genes in the control unstressed and drought/ABA-stress imposed shoots of aforesaid NILs. The green, black, and red color scale at the top represent low, medium, and high levels of average normalized log<sub>2</sub> signal expression value of genes in the shoot tissue of NILs, respectively. The genes and NILs used for expression profiling are indicated on the right and upper part of the expression map, respectively. D and E, Gene structural organization depicting the accurate position (bp) of the G-box cis-regulatory elements (binding site for CabHLH10) in the 3-kb upstream regulatory regions (promoter) of two strong yield-enhancing PE genes encoding CaCAB protein (D) and basic leucine zipper (bZIP) transcription factor (TF) (E). CDS: coding sequence; FD: functional domain. (F, G) ChIP-qPCR assay confirmed the binding of CabHLH10 to the G-box cis-regulatory elements in the promoters of the two yield-enhancing PE genes, CaCAB protein (F) and bZIP TF (G). ChIP-qPCR was performed to amplify the immunoprecipitated DNA with forward/reverse primers (indicated by F and R in Figure D and E) targeting the G-box cis-regulatory element-binding sites in the PE genes. The ChIP-qPCR results are presented as fold changes by dividing the signals from ChIP with anti-CabHLH10 antibody by the IgG control. Vertical error bars represent the mean  $\pm$  standard deviation for each sample with 3 independent replicates (n = 3). \*Significance of gene enrichment in NILs as compared to internal control IgG (P < 0.01, two-tailed t-test). L/HDYI(P/H): low/high drought yield index per plant/hectare. NIL: near isogenic line. NS: non-significant.

(≥ 1.8-fold), lateral root number (≥ 2.0-fold), fresh shoot weight (≥ 2.0-fold), shoot height (≥ 1.9-fold), and relative water content (≥ 1.7-fold) under both unstressed and drought stress conditions in the transgenic chickpea lines compared to the wild-type (WT) plants was observed (Supplemental Figure 17). Under drought stress, the WT showed significant loss of shoot biomass (1.7-fold), whereas transgenic lines showed minimal loss (Supplemental Figure 17, G and H). *CabHLH10* expression was also significantly higher in the root (4.2-fold) and shoot (3.8-fold) tissues of transgenic chickpea lines (Supplemental Figure 17, J). Further, we demonstrated that overexpression of the

CabHLH10 in Arabidopsis bHLH10 mutant improves the drought tolerance of the transgenic lines (Supplemental Figure 18). Under water-deficit stress (water withheld for 3-weeks), the survival rate of the mutant (15%) was significantly lower compared to the WT (66%) and transgenic lines (55%) after recovery (Supplemental Figure 18, A-C). Significant reduction (2.2-fold) in the relative water content (RCW) accompanied by faster rate of water loss of the mutant leaves was observed in the mutant compared to the WT and transgenic lines (Supplemental Figure 18, D and E). This suggests that CabHLH10 functionally complements the bHLH10 mutant indicating its functional role in conferring drought tolerance and that susceptibility to drought in the bHLH10 mutant was caused by lack of bHLH10 function. Thus, our overall findings corroborated well with the aforementioned results observed in the HDYI(P/H)-NILs containing the superior CabHLH10 gene haplotype. We postulated that the enhanced drought tolerance and improved agro-morphological traits observed during drought stress were due to the overexpression of CabHLH10 in the transgenic lines. The overall evidences further indicate that CabHLH10 delineated in this study plays an important role in enhancing drought tolerance and yield in chickpea.

### Discussion

# An integrated next-generation genomics-assisted breeding strategy delineates functionally relevant *CabHLH10* TF gene enhancing yield/productivity in chickpea under drought stress

Improvement of yield and productivity is the ultimate target of crop improvement program in water-limited environments. Deciphering the molecular genetic basis of complex quantitative drought-tolerance trait and identification of potential molecular tags linked to drought-responsive QTLs/ genes is vital for achieving enhanced yield and productivity during drought stress in chickpea. Here, we employed a genome-wide NGS-driven integrated genomic strategy involving high-resolution GWAS, gene-by-gene regional association analysis, QTL/fine-mapping, map-based cloning, molecular haplotyping, and haplotype-specific association analysis in an IL-based association panel and -mapping population (RILs/NILs) to genetically dissect seed yield traits in chickpea under drought stress, including DYI(P/H). This strategy successfully uncovered a promising bHLH TF gene, CabHLH10, of a drought-responsive major QTL and its derived superior natural haplotypes regulating the DYI(P/H) traits in chickpea. This goal was achieved quickly due to the use of ILs with multiple desirable genetic attributes, such as a high degree of genetic relatedness/homogeneity and a low level of population genetic structure, as well as strong heritability of quantitative yield traits under drought stress (Tsujimoto, 2001; Yano et al., 2016; Rockman and Kruglyak, 2009; Venuprasad et al., 2011; Zhang et al., 2012). These useful characteristics of ILs also allowed us to

efficiently scan and exploit potential abiotic stress tolerance allelic variants from a wild Cicer gene pool with homogeneous genetic backgrounds of cultivated desi and kabuli chickpea for genomics-assisted crop improvement. The greater efficiency of these homogeneous IL-based genetic resources compared to commonly used natural association panels and mapping populations with heterogeneous genetic backgrounds allowed us to rapidly decipher the complex genetic architecture of quantitative yield traits under drought stress. The efficiency of our approach is also attributable to the greater utility of ILs for fine-mapping/ map-based cloning and association mapping via the generation of more recombination events, ultimately leading to a reduction in the extent of LD and an overall increase in mapping resolution in chickpea, which is known for its narrow genetic base. Therefore, the integrated genomic strategy employed in this study could be useful for detecting non-spurious marker-trait association and causal genes governing important agronomic traits, thereby facilitating marker-assisted genetic improvement of chickpea and other crop plants.

# Superior natural haplotype of *CabHLH10* improves drought tolerance and enhance yield/productivity in chickpea during drought by modulating ABA signaling and transcription of PE genes

To infer the functional importance of CabHLH10 for drought tolerance, we deployed a gene haplotype-assisted foreground and background selection to precisely identify the most promising recombinants and to develop HDYI(P/H)- and LDYI(P/H)-NILs with introgressions of CabHLH10 gene haplotypes (HAP B and HAP A) with excellent recovery (98%–99%) of the recurrent parental genome. Comprehensive phenotypic evaluation of HDYI(P/H)-NILs containing introgressions of superior CabHLH10 gene haplotype (HAP B) exhibited improved root and shoot biomass contributing to yield enhancement under drought/ABA stress. The HDYI(P/ H)-NILs harboring an introgression of the superior CabHLH10 gene haplotype (HAP B) performed better than seven high-yielding Indian desi and kabuli cultivated chickpea varieties and a wild C. reticulatum accession, exhibiting enhanced yield and productivity during drought stress without compromising other desirable agronomic traits. The improved agronomic performance of the HDYI(P/H)-NIL is attributable to the selection of a superior HAP B gene haplotype derived from a superior drought-tolerant and highyielding stable introgression line (IL105) with minimal pleiotropic/epistatic effects on other agronomic traits. Furthermore, enhanced recovery of the parental recurrent genome (up to 98.8%-99.7%) by haplotype-assisted selection, and the absence of linkage drag effects on other loci governing agronomic traits also minimizes the undesirable effects on other traits of agronomic importance in the developed drought-tolerant high-yielding NIL. To rule out the possibility of any negative undesirable effects of the said superior haplotype on other biotic stress, the developed droughttolerant, high-yielding NIL (HDYI(P/H)-NILs) are currently being evaluated in the National Chickpea Varietal Field Trials across different agro-climatic regions of India under optimal growth conditions. So far, the Field Evaluation Trials showed complete resistance of HDYI(P/H)-NIL to major chickpea diseases such as Fusarium wilt (Races 1, 2, 4) and Ascochyta blight as well as mild resistance to Collar rot, Dry root rot and Pod borer. With the completion of twoyears of multilocation National Field Trials, the developed HDYI(P/H)-NIL may be released as an improved droughttolerant, high-yielding chickpea variety with superior agronomic performance. Genomics-assisted breeding strategies are successfully being deployed for introgression of major genomic loci into multiple leading chickpea varieties resulting in development of multiple improved a/biotic stress tolerant varieties with higher yield under rainfed conditions in chickpea (Varshney et al., 2013b, 2014b; Pratap et al., 2017; Mannur et al., 2019; Bharadwaj et al., 2021). The overall evidences obtained from the genetically tailored CabHLH10 introgressed marker-assisted breeding lines as well as chickpea and Arabidopsis transgenics clearly indicate that CabHLH10 plays a vital role in enhancing yield under drought stress in chickpea.

Drought stress is known to activate ABA biosynthesis, which in turn induces the expression of a diverse array of drought-inducible genes in crop plants. The MYC2-type bHLH TF is an ABA and drought-responsive gene that regulates plant tolerance to drought by orchestrating various downstream drought/ABA-inducible genes as a transcriptional activator in the ABA signaling pathway (Abe et al., 2003). MYC2 is known to specifically bind to the G-box elements in the promoter of RD22, a dehydration- and ABA-responsive gene, activating the drought-induced expression of RD22 to confer ABA-dependent response and drought tolerance in crop plants (Abe et al., 2003). Here, we demonstrated that CabHLH10 binds to the cisregulatory G-box element in the promoter of CaRD22 underlying a major trans-eQTL. Our study also assured that drought- and ABA-stress induces the expression of a bHLH TF gene, CabHLH10 in chickpea (Figure 9) (Kazan and Manners, 2013). The enhanced expression of a natural superior CabHLH10 gene haplotype (HAP B) in the root and shoot of HDYI(P/H)-NILs compared to their counterparts LDYI(P/H)-NILs during drought and ABA stress was observed (Figure 9). The enhanced accumulation of CabHLH10 gene/haplotype-specific transcript and the interaction of CabHLH10 with the CaRD22 promoter potentially led to increased CaRD22 expression in HDYI(P/ H)-NILs compared to LDYI(P/H)-NILs (Figure 9). Thus, the higher expression level of the superior CabHLH10 gene haplotype leads to the induction of its downstream gene, CaRD22, which helps the plant better adapt to drought conditions. However, no significant differences in the expression of both CabHLH10 and CaRD22 genes in LDYI(P/H)-NILs under drought/ABA stress was observed (Figure 7, A and B). We infer that because the drought sensitive LDYI(P/H)-NILs carry the introgression of the inferior HAP A haplotype inherited from the drought sensitive parental IL [LDYI(P/H)-IL77], therefore it does not seem to respond to drought or ABA stress, which is consistent with its reduced root and shoot physiological trait characteristics during drought stress (Figures 4 and 5). Interestingly, we also observed higher ABA levels in the HDYI-NILs during drought stress consistent with previous reports that several bHLH genes are involved in the induction of ABA biosynthesis for enhancing drought tolerance (Toledo-ortiz et al., 2003; Muhammad Aslam et al., 2022). Therefore, we postulated that the enhanced transcriptional activity of both CabHLH10 and CaRD22 in response to drought/ABA stress influence ABA biosynthesis, indicating possible feedback of both genes to better equip the plants for drought sensing and defense via the ABA-mediated signaling pathway (Xiong and Zhu, 2003; Zong et al., 2016). Summarily, CabHLH10 functions as transcriptional activator of certain drought/ABA-inducible genes, including the trans-eQTL regulating CaRD22 expression during drought stress in chickpea.

PE is a vital metabolic trait that directly contributes to crop grain yield since yield is determined by how efficiently a crop converts light energy into biomass through photosynthesis (De Souza et al., 2017). Therefore, enhancing PE is a desirable trait for enhancing crop yield during drought. Several PE parameters have widely been used to measure PE as an indicator of grain yield potential during normal and drought stress conditions in several crops (Guóth et al., 2009; Yamori et al., 2016; De Souza et al., 2017; Basu et al., 2019). The enhanced PE in HDYI(P/H)-NILs was accompanied by upregulated expression of yield-enhancing PE-associated genes in these HDYI(P/H)-NILs, especially under drought/ stress (Figure 9). Interestingly, ABA two strong yield-enhancing PE genes, encoding CaCAB protein, and a bZIP TF, were transcriptionally regulated by a trans-eQTL harboring CabHLH10 through its sequence-specific binding to the G-box cis-regulatory elements in their promoter regions, thereby enhancing overall PE and yield in the HDYI(P/H)-NILs during drought stress (Figure 9). Various genes/TFs in multiple crops are known to play roles in regulating photosynthesis-related metabolic pathways to increase the production of carbohydrates and their allocation to seeds, thereby enhancing seed yields and improving drought stress tolerance by increasing photosynthetic capacity (Oh et al., 2005; Zhang et al., 2008; Xu et al., 2012; Basu et al., 2019). Overall, the results suggests that CabHLH10 improved root and shoot physiological traits as well as higher PE contributing to higher yield and productivity in the HDYI(P/H)-NILs under drought-stress conditions.

In conclusion, the HDYI(P/H)-NILs generated in this study, with superior allelic combinations of genes influencing DYI(P/H) traits, could serve as valuable donor genetic resources for developing drought-tolerant, high-yielding chickpea varieties with improved agronomic traits. Therefore, the molecular tags delineated in this study have the potential to



**Figure 9** Schematic representation of the transcriptional regulatory role of *CabHLH10* in enhancing yield and productivity of chickpea during drought stress. The diagram depicts differential induction and higher expression of *CabHLH10*, *CaRD22*, and yield-enhancing PE genes in high [HDY1(P/H)-NIL<sup>CabHLH10(HAPB)</sup>] versus low [LDY1(P/H)-NIL<sup>CabHLH10(HAPA)</sup>] DY1 *CabHLH10* gene haplotype-introgressed NILs during drought and/or ABA stress. Drought stress triggers the synthesis and production of ABA (in both HDY1 and LDY1 NILs) which induces the expression of *CabHLH10*. CabHLH10 then binds to the G-box cis-regulatory elements in the promoter of a known drought/ABA-responsive gene, *CaRD22*, indicating a possible transcriptional role for *CabHLH10* in enhancing *CaRD22* expression, potentially leading to upregulation of various downstream drought/ABA-responsive genes to impart confer ABA-dependent drought tolerance in chickpea. The green, black, and red color scale represents N (green): No change, M (black): Moderately upregulated and H (red): Highly upregulated expression of *CabHLH10* (upper panel), *CaRD22* (upper-middle panel), and yield-enhancing PE (lower middle panel) genes in the drought and/or ABA stress-imposed root and shoot tissues of NILs compared to the control. The figure also shows improved root and shoot biomass as well as PE resulting in higher drought yield index (DYI, lowermost panel) in high DYI- compared to low DYI-NILs, possibly due to the enhanced expression of yield-enhancing PE genes. The expression of two strong yield-enhancing PE genes (CaCAB protein and bZIP transcriptional activator. The red and green colored arrows (lower panel) representing high and low PE/DYI, respectively. The NILs showing the introgressed regions of high (HAP B) and low (HAP A) DYI(P/H) *CabHLH10* gene haplotypes on chromosome 1, indicated on the extreme left and right, respectively. HAP: haplotype, L/HDYI(P/H): low/high drought yield index per plant/hectare.

uncover the genetic architecture and molecular mechanism underlying drought-tolerance traits that contribute to enhanced yield/productivity in chickpea. This information should drive translational genomic studies for crop improvement and the development of superior, genetically tailored, drought-tolerant chickpea cultivars with enhanced pod/seed yield and productivity to help ensure global food security.

## **Materials and methods**

#### Development of introgression lines (ILs)

A set of 222 near-about homogeneous chickpea (Cicer arietinum) introgression lines (ILs) was selected from 32 advanced generation back-cross mapping populations  $(BC_3F_7)$  to constitute an association panel. These back-cross mapping populations were developed (following conventional phenotypic selection) by inter-crossing among seven desi, kabuli and wild chickpea accessions opting either as donor or recurrent parents in the back-cross breeding program initiated at the International Crops Research Institute for the Semi-Arid Tropics (ICRISAT), Patancheru, Hyderabad, India. The said seven accessions included four desi (ICC 4958, ICCV 93954, ICCV 10, and Annigeri), two kabuli (ICC 12968 and ICCV 92311) and one wild (Cicer reticulatum) (ICC 17160) chickpea with contrasting seed yield traits. The comprehensive strategies adopted to develop ILs are illustrated in Supplemental Figure 1.

# Field phenotyping for yield traits under drought stress

The ILs belonging to an association panel were grown as per randomized complete block design (RCBD) in the experimental field with at least three replications for three consecutive years (2012-2014) at the ICRISAT (latitude/ longitude: 17.1°N/78.9°E) under irrigated (IR, control unstressed) and unirrigated (UIR, water withheld drought stress) conditions during crop season (September to December) following Ramamoorthy et al. (2016, 2017). Subsequently, these ILs were phenotyped for major yield traits including pod number (PN), seed number (SN), 100-seed weight (SW), yield per plant (YP), yield per hectare (YH), drought yield index per plant [DYI(P)] and drought yield index per hectare [DYI(H)] both during IR and UIR conditions across three individual years (2012-2014) and over all years. PN, SN, SW, and YP traits were measured following previous methods (Singh et al., 2016; Shimray et al., 2017). Briefly, PN and SN for each IL were estimated by counting the average number of fully-matured pods and seeds per plant, respectively. The SW of each IL was calculated by measuring the average weight of 100-matured seeds at 10% moisture content. YP was calculated by weighing the average weight (g) of fully-matured dried seeds (at 10% moisture content) harvested from 10 to 12 representative plants of each IL. YH was measured by weighing the seed yield (kg) from all the plants of ILs with at least 60% of optimum plant stand in the field plots. DYI(P) and DYI(H) of each IL were estimated in accordance with Raman et al. (2012) following  $DYI(P) = (YP)_{US}/(YP)_{DS}$  and  $DYI(H) = (YH)_{US}/(YH)_{DS}$ , respectively, in which US/DS indicates unstressed control IR versus drought stress UIR. The genetic inheritance characteristics of the traits were measured in an association panel by estimating the coefficient of variation, frequency distribution and Pearson's correlation coefficient (r) among ILs as described (Bajaj et al., 2015a, b; Upadhyaya et al., 2015). The analysis of variance (ANOVA) was employed to estimate the effect of genotypes (G) and phenotyping experimental years/environments (E) as well as their G × E interaction using SPSS v17.0 (http://www.spss.com/statsistics) (Srivastava et al., 2017). The broad-sense heritability  $[H^2 = \sigma^2 g/(\sigma^2 g + \sigma^2 ge/n + \sigma^2 e/nr)]$  was measured in accordance with  $\sigma^2 g$  (genetic),  $\sigma^2 ge$  (G × E) and  $\sigma^2 e$  (error) variance with n (number of experimental years/environments) = 3 and r (number of replicates) = 3 as per Bajaj et al. (2015a).

### Genotyping-by-sequencing assay

To construct a  $3 \times 96$ -plex Genotyping-by-sequencing (GBS) libraries, the genomic DNA isolated from 222 ILs (association panel) along with seven chickpea accessions (used as parents to develop ILs) was digested with ApeKI and ligated to adapters carrying unique barcodes. These libraries were pooled together and sequenced (100-bp paired-end) using an Illumina HiSeq2000 (Illumina Inc., USA) next-generation sequencing (NGS) platform (Elshire et al., 2011; Spindel et al., 2013; Kujur et al., 2015a, b, c). The reproducibility of the GBS assay was determined using the four desi (ICC 4958, ICCV 93954, ICCV 10, and Annigeri), two kabuli (ICC 12968 and ICCV 92311) and one wild Cicer reticulatum (ICC 17160) chickpea accessions as biological replicates (Supplemental Table 1). For sequence quality assessment, the raw FASTQ paired-end sequence reads (~100 base long) generated from each IL/accession were filtered using the recommended Illumina pipeline and NGS QC Toolkit v2.3 (Patel and Jain, 2012) to remove the low-quality including primer/adaptor contaminated sequence reads. The high-quality sequence reads (a phred score of  $\geq 10$ ) were further de-multiplexed based on their unique barcodes to extract reads of individual ILs/accessions. The demultiplexed sequence reads of each IL/accession were aligned and mapped to the reference chickpea genome of kabuli (CDC Frontier; Varshney et al., 2013a; http://gigadb.org/dataset/ 100076] using Burrows-Wheeler Aligner (BWA) tool (Bowtie v2.1.0) with default parameters (Langmead and Salzberg, 2012) to generate the sequence alignment map (SAM) files. The SAM files were subsequently used for genome-wide mining of SNPs from ILs/accessions of chickpea.

#### Discovery and genotyping of genome-wide SNPs

To mine accurate SNPs from 222 ILs and seven parental chickpea accessions at a genome-wide scale, the SAM files were processed using the GBS pipeline of STACKS v1.0 (Catchen et al., 2013; http://creskolab.uoregon.edu/stacks) following Kujur et al. (2015a, b, c). In STACKS, a maximum-likelihood statistical model was used to screen all the valid and high-quality SNPs with no sequencing errors and SNP base quality of 20, supported by minimum sequence read-depth of 10. The structural and functional annotation of these SNPs on the diverse coding and non-coding sequence components of genes (.GFF file) and genome (chromosomes/ pseudomolecules and unanchored scaffolds) of *kabuli* chick-pea (Varshney et al., 2013a) were performed using the customized Perl scripts, single-nucleotide polymorphism effect

predictor (SnpEff v3.1 h; http://snpeff.sourceforge.net) and PFAM database v27.0 (http://pfam.sanger.ac.uk) as per Kujur et al. (2015a, b). Circos (Krzywinski et al., 2009) was employed to visualize the overall genomic distribution of SNPs with synonymous and non-synonymous substitutions based on their physical positions (bp) across eight chromosomes (pseudomolecules) of *kabuli* chickpea genome.

Molecular diversity and population genetic structure To determine the molecular diversity and construct an unrooted neighbour-joining (NJ) phylogenetic tree (Nei et al. (1983) with 1000 bootstrap replicates), the genome-wide SNP genotyping information among 222 ILs (association panel) was analyzed in the PowerMarker (Liu and Muse, 2005) and MEGA7 (Kumar et al., 2016) following Kujur et al. (2015a, c). To infer the population genetic structure, genome-wide SNP genotyping information scanned from 222 ILs were analyzed in Bayesian clustering algorithm of STRUCTURE v2.3.4 (Pritchard et al., 2000) using the admixture and correlated allele frequency with the burn-in of 100,000 iterations, runlength of 100,000 and population number (K) 1-10. The optimal value of K was estimated using the *ad-hoc* approach of Pritchard et al. (2000) and *delta* K strategy of Evanno et al. (2005). Accordingly, various population genetic parameters including genetic divergence (FST) and degree of admixture among population groups of ILs were estimated.

#### LD decay

To estimate the genome-wide LD decay, the genotyping data of SNPs physically mapped on eight chickpea chromosomes were analyzed by a command (-r2 -ld-window 99999 ld-window-r2 0) line interface of PLINK (Purcell et al., 2007) and the full-matrix approach of TASSEL (http://www. maizegenetics.net) (Bradbury et al., 2007) following Zhao et al. (2011) and Kujur et al. (2015c). The genome-wide LD decay was determined by plotting the average  $r^2$  (correlation coefficient; frequency correlation among pair of alleles across a pair of SNP loci) estimated from the population (defined by population genetic structure) of a constituted association panel of ILs against the 50-kb uniform physical intervals across eight chromosomes. The statistical significance by comparing the  $r^2$  values of LD across/within population group of ILs was performed employing the ANOVA interface tool of SPSS v17.0.

#### Genome-wide association study

For genome-wide association study (GWAS), the genomewide SNP genotyping data was integrated with multienvironments (three individual years and over all years) replicated field phenotyping data of yield traits under control unstressed (IR) and drought stress (UIR) including PN, SN, SW, YP, YH, DYI(P), and DYI(H) as well as population structure (Q), kinship (K) and PCA (P) information of 222 ILs (association panel). The GAPIT (Lipka et al., 2012) and SPAGeDi 1.2 (Hardy and Vekemans, 2002) were used to estimate the PCA and K-matrix, respectively, among ILs. All these SNP Thakro et al.

genotyping and trait phenotyping as well as molecular diversity and genetic relatedness information obtained among 222 ILs were analyzed by a compressed mixed linear model (P + K, K, and Q + K (Zhang et al., 2010) interface of GAPIT (Lipka et al., 2012) following Kujur et al. (2015a) and Kumar et al. (2015). To assure the accuracy of SNP marker-trait association in GWAS, the quantile-quantile (Q-Q) plot-based Benjamini and Hochberg false discovery rate (FDR cut-off  $\leq$ 0.05) corrections were employed for multiple comparisons between observed/expected  $-\log_{10}(P)$ -value and adjusted P-value threshold of significance (Kujur et al., 2015a). Accordingly, SNP loci significantly associated with the traits were identified by individual year-wise and in three-years over all at a lowest FDR adjusted P-value (threshold  $P < 1 \times$  $10^{-8}$ ) and highest R<sup>2</sup> in an association panel. The magnitude  $(R^2)$  of phenotypic variation explained (PVE) for the traits was measured by an FDR-controlling method of model with the SNP (adjusted P-value).

#### High-resolution QTL mapping

The GBS-derived genome-wide SNPs exhibiting polymorphism between two parental ILs [LDYI(P/H)-IL-77 and HDYI(P/ H)-IL-105] (selected from an association panel) contrasting for yield traits under drought stress [PN, SN, SW, YP, YH, DYI(P), and DYI(H)] were screened. These SNPs were genotyped among 190 mapping individuals of a F<sub>8</sub> RIL population  $[LDYI(P/H)-IL-77 \times HDYI(P/H)-IL-105]$ using Sequenom MALDI-TOF MassARRAY assay (http://www.sequenom.com) as per Saxena et al. (2014a, b). The high-throughput SNP genotyping data generated from a RIL mapping population was used to construct a genetic linkage map at the higher logarithm of odds (LOD) threshold (4.0-10.0) with Kosambi mapping function using JoinMap 4.1 (https://www.kyazma.nl/ index.php/JoinMap) as described (Kujur et al., 2015b). A highdensity genetic linkage map was constructed by integrating SNPs in accordance with their centiMorgan (cM) genetic distance and respective marker physical positions (bp) on eight linkage groups (LGs) (designated as LG1 to LG8)/chromosomes and further visualized by a Circos following Das et al. (2015).

For high-resolution QTL mapping, the genotyping data of parental polymorphic SNPs genetically mapped on a highdensity genetic linkage map (eight LGs/chromosomes) were integrated with multi-environments (years) field phenotypic data of DYI(P) and DYI(H) as well as PN, SN, SW, YP, and YH traits of a RIL mapping population. This was performed using a composite interval mapping (CIM) function (LOD > 4.0 with 1,000 permutations and  $P \le 0.05$ ) of MapQTL 6 (Van Ooijen, 2009) as per Das et al. (2015) and Kujur et al. (2015b). The PVE (%) as well as positional and additive effect (evaluated by parental origin of favorable alleles) specified by each significant QTL were measured at a significant LOD ( $P \le 0.05$ ) following Bajaj et al. (2015b). The confidence interval (CI) of each significant major QTL peak was evaluated by using  $\pm 1$ -LOD support intervals (95% CI). The reaction norm plots of major DYI(P/H) QTLs detected

across three individual years and over all years were made and visualized by "rxnNorm" of R package.

# Regional association analysis and molecular haplotyping

genomic region  $(\sim 100 \text{ kb})$ The flanking the GWAS-derived SNP loci associated with DYI(P/H) traits and a strong DYI(P/H) trait-associated CabHLH10 gene were targeted for regional association analysis and molecular haplotyping, respectively. For this, the selected genomic/gene regions were sequenced using the genomic DNA of 222 ILs (association panel) as well as 86 desi and kabuli chickpea accessions and 81 wild Cicer accessions employing the multiplexed amplicon sequencing protocol (as per manufacturer's instructions) of TruSeq Custom Amplicon v1.5 in Illumina MiSeq NGS platform (Supplemental Tables 1 and 9 and 10). The wild Cicer accessions included five annual wild species of primary and secondary genepools, namely C. reticulatum (16 accessions), C. echinospermum (8), C. judaicum (22), C. bijugum (19), and C. pinnatifidum (15) as well as one perennial accession of tertiary genepool C. microphyllum. The custom oligo probes targeting the selected genomic regions including coding DNA sequences (CDS)/exons and introns as well as 3 kb of each up/down-stream regulatory regions (URR/DRR) of genes were designed using Illumina Design Studio and synthesized further for their use in targeted multiplexed amplicon sequencing. The pooling of amplicons (an average size of 500 bp per reaction) into the custom amplicon tubes, construction of template libraries, normalization of the uniquely tagged pooled amplicon libraries and sequencing of generated clusters by Illumina MiSeq platform were performed as per Kujur et al. (2015b), Bajaj et al. (2015a) and Malik et al. (2016). The mapping of high-quality amplicon sequence reads onto reference kabuli chickpea genome (Varshney et al., 2013a) and detection of high-quality SNPs among ILs/accessions as well as their structural and functional annotation were carried out accordingly (Bajaj et al., 2015a; Kujur et al., 2015b; Malik et al., 2016). Subsequently, the constitution of SNP haplotypes in the sequenced genes and/or genomic regions and determination of SNP haplotype-based LD and domestication pattern including estimation of association potential of the haplotypes with DYI(P/H) traits were performed (Kujur et al., 2015a, b).

## Fine-mapping and map-based cloning

To fine-map a major CaqDYI(P/H)1.1 QTL identified by high-resolution QTL mapping, 380 mapping individuals of a F<sub>2</sub> population [LDYI(P/H)-*NIL*<sup>CaqDYI(P/H)1.1</sup> × HDYI(P/ H)-*NIL*<sup>CaqDYI(P/H)1.1</sup>] along with parental ILs were genotyped by amplicon resequencing-based SNPs using Sequenom MALDI-TOF MassARRAY (Saxena et al., 2014a, b). Subsequently, these SNP genotyping data were integrated with the field phenotyping information of yield traits generated from mapping individuals during control unstressed (IR) and drought stress (UIR) for high-resolution QTL mapping following aforesaid strategy.

For marker (haplotype)-assisted foreground selection, the SNPs flanking/tightly linked to the low and high DYI(P/H) haplotypes of a CabHLH10 gene in the CaqDYI(P/H)1.1 major QTL region were genotyped among mapping individuals of the back-cross population by the MALDI-TOF assay following Saxena et al. (2014a, b). Like-wise, for marker (haplotype)-assisted background selection, 1536 SNPs mapped uniformly across eight chromosomes of chickpea genome were genotyped in the selected recombinants (backcross mapping individuals) using MALDI-TOF assay. For large-scale phenotyping of back-cross mapping population, the individuals were phenotyped for seed yield traits across multiple environments (three years) in the field as per RCBD with at least three replications under control unstressed and drought stress conditions following aforesaid strategies.

For progeny analysis, the homozygous recombinant and homozygous non-recombinant individuals derived from the low and high DYI(P/H) NILs were selected based on their genetic constitution and considering the recombination among SNPs flanking/tightly linked to the low and high DYI(P/H) haplotypes of a CabHLH10 gene in the CaqDYI(P/H)1.1 major QTL region. The selected recombinant and non-recombinant progenies were grown in the field as per RCBD with three replications across multiple environments (three years) and individual progenies were phenotyped precisely for yield traits under control unstressed and drought stress conditions. The significant variation of DYI(P/H) traits between selected recombinant and non-recombinant progenies were evaluated by a statistical one-tailed t-test. To evaluate the superiority of developed low and high DYI(P/H) gene haplotype-introgressed NILs for desirable agronomic traits, these lines along with parental ILs, six cultivated, and one wild C. reticulatum accessions were grown in the field as per RCBD (with three replications) across multiple environments (three years) under control unstressed and drought stress conditions, and further phenotyped for yield traits under drought stress.

# Genome-wide identification and genomic constitution of bHLH TF genes

To identify diverse class of *bHLH* TF genes annotated from the *kabuli* chickpea genome (Varshney et al., 2013a), a genome-wide scan was performed through HMMER search (http://hmmer.org) with an E-value cutoff of 1e-05. Using the amino acid sequences of bHLH protein freely accessible at NCBI (https://www.ncbi.nlm.nih.gov), a hidden markov model (HMM) profile was made. The output amino acid sequences of HMM were further analyzed by INTERPRO (https://www.ebi.ac.uk/interpro) to ascertain the presence of functional bHLH domains in the identified *bHLH* genes. The genomic distribution and identity of *bHLH* genes was determined in chickpea based on their lower to higher physical positions (bp) on the eight chromosome pseudomolecules and unanchored scaffolds of *kabuli* genome, and further visualized with a MapChart 2.2 (Voorrips, 2002).

#### Phylogeny of CabHLH10

The amino acid sequence of a CabHLH10 was reciprocal BLAST searched against the protein sequences from the genomes of sequenced model dicot plant species, Arabidopsis thaliana (https://www.arabidopsis.org/) as well as other legumes including Arachis duranensis, Arachis hypogaea, Arachis ipaensis, Cajanus cajan, Cicer arietinum, Glycine max, Phaseolus vulgaris, Medicago truncatula, Lotus japonicus, Trifolium pretense, Lupinus angustifolius, Vigna angularis, and Vigna radiata https://phytozome.jgi.doe.gov/pz/portal.html, (Phytozome; Legume Information System; https://legumeinfo.org/ and NCBI; https://www.ncbi.nlm.nih.gov/). The presence of signature bHLH domains in the orthologous bHLH gene sequencepairs were further assured by INTERPRO. Multiple sequence alignment of the bHLH functional domain in the amino acid sequence encoded by a CabHLH10 gene with its Arabidopsis and legumes orthologs was performed using the BLOSSUM62 interface of CLUSTALW and accordingly an unphylogenetic tree was constructed by rooted а Neighbor-Joining (NJ) method and visualized in MEGA7 (www.megasoftware.net/, Kumar et al., 2016).

# Reverse transcription quantitative PCR (Rt-qPCR) assay

Total high-quality RNA was isolated from shoots and roots of control unstressed as well as drought and ABA stress-imposed plants of low and high DYI(P/H) NILs/ILs using TRIzol (Sigma-Aldrich, USA) reagent and RNeasy MinElute Cleanup Kit (QIAGEN, USA) following manufacturer's instructions. The differential expression analysis was performed by the gene-specific primers (Supplemental Table 14) using the said tissues of the NILs/ILs following Bajaj et al. (2015a) and Upadhyaya et al. (2015). Briefly, 2 µg of high-quality DNase-treated RNA was used to synthesize cDNA by High-capacity cDNA Reverse Transcription Kit of Applied Biosystems (ABI, USA). The diluted cDNA (1:100 dilution) and 1X Fast SYBR Green Master Mix (ABI) as well as 200 nM of forward and reverse primers in a total reaction volume of 10 µl were used for amplification in the ABI7500 Fast RT-PCR system following manufacturer's instructions. Three biological replicates each with at least three technical replicates were used to calculate the mean relative expression level. An elongation factor 1-alpha (EF1 $\alpha$ ) gene was used as an endogenous control for normalization of the cDNA samples (Garg et al., 2010). The  $2^{-\Delta CT}$  method was employed to determine the expression pattern of genes and two-tailed t-test was used to calculate the significant differences in expression levels of selected genes (Mukhopadhyay and Tyagi, 2015; Malik et al., 2016).

### RNA-seq assay for global transcriptome profiling

For RNA-seq based global transcriptome profiling, the total high-quality RNA isolated from three independent biological replicates of root and shoot tissues of control (unstressed) as well as moisture and ABA stress-imposed 20-days-old pot-soil-grown seedlings of low and high DYI(P/H) NILs/ILs was used to constitute the paired-end cDNA libraries. All these libraries were sequenced using the Illumina HiSeq2000 platform to generate 100-base-long paired-end (PE) sequence reads for each NIL/IL sample. The raw Fastg sequences were filtered by NGS QC Toolkit v2.3 to discard the low-guality reads and further accessed for various quality parameters to be considered as high-quality sequence reads. The high-quality sequence reads were subsequently mapped on the reference kabuli chickpea genome (Varshney et al., 2013a) using TopHat v2.0.0 with default parameters. The mapped sequences of each NIL/IL sample were analyzed in Cufflinks v2.0.2 to obtain the normalized estimation of gene expression based on FPKM (fragments per kilobase of transcript per million mapped reads). Hierarchical clustering and PCA were performed employing corrplot and prcomp utilities of R package. The differential expression between all pairs of NIL/IL samples was estimated using Cuffmerge and Cuffdiff as per Srivastava et al. (2016). The genes exhibiting a difference of at least two-fold expression change between two given experimental NIL/IL samples with corrected P-value  $\leq 0.05$ after analyzing FDR (q-value)  $\leq 0.05$  were considered significant to be differentially expressed and visualized with a heat map using a MultiExperiment Viewer (MeV, http://www.tm4.org/mev). The stage-specific/preferential genes expressed in the NILs/ILs were identified using SS scoring algorithm as per Zhang et al. (2015). The higher value of SS score with the maximum expression level of a gene in a particular stage as compared to that of other stages analyzed signifies the more specific gene expression at that stage.

#### eQTL mapping

For eQTL mapping, the differential expression profiling of CaRD22, CaCAB, and CabZIP genes were performed in the control unstressed and drought stress-imposed root and shoot tissues of parental NILs and 380 individuals of a F<sub>2</sub> mapping population [LDYI(P/H)-NIL<sup>CaqDYI(P/H)1.1</sup> × HDYI(P/ H)-NIL<sup>CaqDYI(P/H)1.1</sup>] through RT-qPCR assay (as described) using primers enlisted in Supplemental Table 14. The Pearson correlation coefficient (r) with a statistical significance  $P \leq 0.05$  was used to estimate the correlation and significant difference of expression level of genes with drought tolerance. The differential expression level data of CaRD22, CaCAB, and CabZIP transcripts (as a phenotype) and genotyping data of SNPs (as a genotype) genetically (cM) mapped on eight chromosomes were analyzed using the CIM function of interval mapping (threshold of significance LOD > 3.0 with 1000 permutations and  $P \le 0.05$ ) of MapQTL 6. The major eQTL identified was further assured by QTL window

interface module of QGene 4.3 (Joehanes and Nelson, 2008) as per Bajaj et al. (2015a) as well as using the generalized linear model (GLM) of TASSEL and multiple regression method of Melo et al. (2019). Accordingly, the position (cM) of a major drought-responsive eQTL regulating the relative gene expression level of *CaRD22*, *CaCAB*, and *CabZIP* for the drought tolerance was determined and visualized with "rxnNorm" of R package.

#### **Transient expression analysis**

For transient gene haplotype-specific expression assay, the upstream regulatory (promoter) of low and high DYI(P/H) haplotypes constituted from a CabHLH10 gene were amplified from the DNA of corresponding low and high DYI(P/ H) haplotype-introgressed NILs and parental ILs using specific primers (CabHLH10p F and CabHLH10p R) enlisted in Supplemental Table 14. These were further cloned into a binary plasmid vector pCAMBIA1301 at the BamHI/Sall restriction sites to drive expression of betaglucuronidase (GUS) reporter protein. Agrobacterium tumefaciens strain EHA105 containing this recombinant plasmid along with another plasmid vector pCAMBIA1302 expressing green fluorescent protein (GFP) reporter gene (used for normalization of transformation efficiency) were agro-infiltrated into the young leaves of two months old seedlings of a desi chickpea accession ICCV 93954 following Dwivedi et al. (2017). The normalization of transformation efficiency and estimation of GUS activity from the CabHLH10 gene/haplotype constructs were made using the RT-qPCR assay in accordance with Dwivedi et al. (2017). Three biological replicates each with at least three technical replicates of each gene/haplotype construct were assayed for transient expression study.

### Yeast one-hybrid assay

The CDS of a CabHLH10 gene amplified from the high DYI(P/H) gene haplotype-introgressed NILs were cloned in a Gateway vector pENTR<sup>TM</sup>/D-TOPO<sup>®</sup> (Invitrogen, USA), and were subsequently mobilized into the gateway compatible pGADT7 (pDEST-GADT7) vector using LR clonase II enzyme mix (Invitrogen, USA) according to manufacturer's instructions. Three tandem repeats of wild-type G-box (CACGTG) and mutated G-box (TTCGAC) cisregulatory elements in the URR of a CaRD22 gene were generated by annealing forward and reverse oligonucleotides. The annealed fragments were further cloned in EcoRI-Spel sites of pHis2.1 vector and their presence in the plasmids were confirmed by sequencing as per Kujur et al., (2013). Detailed primer and oligonucleotide sequence information are enlisted in Supplemental Table 14. pHis2.1 vector cloned with normal and created mutated G-box cis-regulatory elements were transformed separately with CabHLH10-pGADT7 in the yeast strain Y187 and checked for yeast growth along with other controls on different dropouts with or without various concentrations of 3-AT.

#### Transient transcriptional activation assay

For transient expression study, the full-length CDS of a CabHLH10 gene/haplotype was amplified using the cDNA of a high DYI(P/H) CabHLH10 gene haplotype-introgressed NILs using gene-specific primers (CabHLH10pRT F and CabHLH10pRT R) enlisted in Supplemental Table 14. The amplified CDS was then cloned into KpnI and BamHI sites of pRT107 vector to constitute an effector construct [35Spro:CabHLH10]. The URR (promoter region upstream to the translation start codon ATG) of a CaRD22 gene targeting normal (CACGTG) G-box cis-regulatory element was amplified from the NILs and cloned into Sall and BamHI sites of pGreenII 0800-LU538C vector to constitute the reporter construct using specific primers (CaRD22pGreen\_F and CaRD22pGreen R) enlisted in Supplemental Table 14. Subsequently, the said effector and reporter constructs were co-transfected into the isolated Arabidopsis mesophyll protoplasts through PEG transformation following Sheen (2001) and Tian et al. (2017). A Renilla luciferase (REN) gene directed by cauliflower mosaic virus (CaMV) 35S promoter harboring in the pGreenII 0800-LUC vector was used as an internal control to measure the Firefly LUC and REN activities by a Dual-Luciferase reporter assay kit of a GloMax 20/ 20 luminometer (Promega, USA). Accordingly, the LUC/REN ratio was estimated by normalizing the activities of LUC to REN. Three biological replicates each with at least three technical replicates representing individual gene haplotype constructs were assayed for transient transcription assay.

#### ChIP qPCR assay

For the ChIP RT-qPCR assay, the NILs introgressed with high DYI(P/H) CabHLH10 gene haplotypes were used to isolate nuclei in order to immunoprecipitate the sonicated chromasuspension with protein-DNA tin complex by Anti-CabHLH10 antibody (Cell Signaling Technology, USA) as described (Sun et al., 2015; Tian et al., 2017). The chromatin precipitated with IgG (Merck-Millipore, USA) was used as a control in ChIP-qPCR profiling. Three biological replicates each with at least three technical replicates representing individual haplotypes were assayed for ChIP-gPCR assay. To perform ChIP-qPCR, the forward and reverse primers specific to CaRD22, CaCAB and CabZIP enlisted in Supplemental Table 14 were used.

#### ABA quantification

For estimation of ABA concentration, the control (unstressed) and ABA stress-imposed root and shoot tissues of 20-days-old pot-soil-grown seedlings of low and high DYI(P/H) NILs/ILs were harvested and stored at  $-80^{\circ}$ C until further use. For ABA extraction, the samples were grounded into fine powder with liquid nitrogen. Subsequently, 50–100 mg of frozen tissues were analyzed on an Agilent 6530 Accurate Mass Q-TOF LC/MS (Agilent Technologies Inc., USA) with a MassHunter Qualitative Analysis software (version B.05.00) following Dave et al. (2011), Miyazaki et al. (2014) and Pang et al. (2017).

Three biological replicates each with at least three technical replicates were used for ABA estimation study.

#### Root histological assay

The low and high DYI(P/H) NILs/ILs were used for root histological assay. Five biological and three technical replicates from both control unstressed and dehydration/moisture stress-imposed root tissues of 20-days-old pot-soil-grown seedlings of said NILs/ILs were collected for root histological studies. Tap roots representing 1 cm above the tips of these NILs/ILs were cut, harvested, and washed. The root sections were further fixed, dehydrated, and embedded in paraplast and prepared for microtomy following Ranjan et al. (2017). Paraffin root sections (8  $\mu$ M) were dissected using rotary microtome (Leica Biosystems, USA) and stained with 0.2% (w/v) toluidine blue (Sigma-Aldrich, USA). Images of the root sections were captured using light microscope (Leedz Micro Imaging Limited, UK) with  $10 \times 10$  magnification (100X). Root anatomical analysis was performed using ImageJ 1.31 v (http://rsb.info.nih.gov/ij/) (Schindelin et al. 2015). The root morphometric parameters including total stele area (TSA), total cortex area (TCA), root cross-sectional area (RXSA), and meta xylem vessel area (MXVA) were measured in both control unstressed and stress-imposed plants of said NILs/ILs as described (Prince et al., 2017).

#### Electrophoretic mobility shift assay (EMSA)

To ascertain the binding of CabHLH10 to the *cis*-regulatory elements of the RD22 promoter, GST-CabHLH10 (CabHLH10 cloned in pGEX-4T1 at EcoRI/Sall sites) was expressed in the bacterial BL21 cells and purified using Glutathione-Agarose (Thermo Scientific, USA). The oligonucleotide probes corresponding to G-box cis-regulatory element (native and mutated form, as used in yeast one hybrid) were labeled by the Biotin 3' End DNA Labeling Kit (Thermo Scientific). EMSA was performed using LightShift Chemiluminescent EMSA Kit (Thermo Scientific) according to the manufacturer's protocol. Biotin-labeled probes were incubated with GST-CabHLH10 or GST at room temperature for 20 min. The free probes and protein-probe complexes were electrophoresed on 6% polyacrylamide gel and further transferred on nylon + membrane. The biotin-labeled DNA was detected through chemiluminescence. Biotin-unlabeled probes were used as competitors in EMSA. Detailed primer sequence information is enlisted in Supplemental Table 14.

### GUS promoter assay

For generation of promoter:GUS transgenics, 1.5 kb of the *CabHLH10* promoter was amplified from the genomic DNA of NILs introgressed with high DYI(P/H) *CabHLH10* gene haplotype, using specific primers (pCabHLH10\_gus\_Fand pCabHLH10\_gus\_R) enlisted in Supplemental Table 14. The amplified fragment was then cloned into Gateway pENTR<sup>TM</sup>/D-TOPO<sup>®</sup> vector (Invitrogen, USA), and then mobilized into the binary vector pGWB3, upstream of the  $\beta$ -glucuronidase synthase (GUS), using LR clonase II enzyme

mix (Invitrogen, USA) according to manufacturer's instructions. The resulting recombinant construct (*CabHLH10*<sub>pro</sub>: *GUS*) was introduced into *Agrobacterium tumefaciens* strain GV3101, which was subsequently used to transform chickpea accession Pusa 362 (*desi*) via cotyledons/seeds explants by *in planta Agrobacterium*-mediated transformation methods following Chakraborti et al. (2006).

Histochemical GUS staining was performed using 5-bromo-4-chloro-3-indoxyl-beta-D-glucuronide (X-gluc, Biosynth, Staad, Switzerland) as a substrate, following the methods of Jefferson et al. (1987) and Khandal et al. (2020). To evaluate the promoter activity, two weeks old chickpea seedlings were vacuum infiltrated with GUS staining solution (50 mM sodium phosphate buffer, pH 7.0, 10 mM EDTA, 0.1% [v/v] Triton X, 0.5 mM ferrocyanide, 0.5 mM ferricyanide, 1.0 mM X-Gluc) for 30 min and incubated overnight in the dark at  $37^{\circ}$ C. Prior to observation, samples were cleared in a solution of ethanol and acetone (3:1) at room temperature for 15 h.

#### Sub-cellular localization

For sub-cellular localization, initially cNLS Mapper program was used to predict the nuclear localization signal (NLS) of CabHLH10 protein sequence. The coding sequences of CabHLH10 was fused with C-terminal sequence of YFP (yellow fluorescent protein) by cloning into pSITE3CA vector under CaMV 35S promoter through gateway technology (Invitrogen, USA) according to the manufacturer's instructions using gene-specific primers (used for Y1H assay; Supplemental Table 14). The YFP fusion constructs along with empty vector (control) were transiently expressed in onion epidermal cells through particle bombardment-based transformation using a Biolistic<sup>R</sup>-PDS-1000/He Particle Delivery System (Bio-Rad, USA) as described by Sharma et al. (2015). After 12-18 h incubation at 28°C, YFP fluorescence signals were observed under a Leica TCS SP8 confocal laser scanning microscope (Leica, Germany) using a 20x Dry objective lenses (HC PL APO 20x/0.75 CS2). YFP fluorescence was excited at 514 nm using an argon laser at 15% intensity and emission at 530 nm detected using a HyD1 detector with a gain of 68% and with a collection band width of 520-560 nm.

#### Plant growth conditions and treatments

The low and high DYI(P/H) NILs/ILs were grown in the potscontaining the agropeat:vermiculite (3:1) mixture at the plant growth chamber as described (Meena et al., 2015). Subsequently, 20-days-old seedlings were used for moisture and hormonal stress and root histological studies. The plants were subjected to dehydration/moisture stress by placing the seedlings on the folds of tissue paper for 12 h treatment at 22  $\pm$  1°C (Garg et al., 2015; Deokar et al., 2015). For ABA treatment, the roots of aforesaid plants were dipped in 100 µM ABA (A1049, Sigma, USA) solution while the control plants were dipped in normal water for 12 h following Meena et al. (2015). The NILs/ILs were grown hydroponically in Hoagland solutions and subjected to dehydration stress as per aforementioned methods. The seeds of NILs/ILs were also germinated on MS (Murashige and Skoog basal salt mixture)-phytagel medium for 10–15 days without (control) or with 100  $\mu$ M ABA in a controlled environment to study the response of their roots and shoots towards ABA stress both at the germination and vegetative stage. Three biological replicates representing both control unstressed and dehydration/ABA stress-imposed roots and shoots of NILs/ILs were collected and stored at -80°C until RNA extraction for further study. The NILs/ILs were grown in the rainout shelter and phenotyped for diverse root and shoot agromorphological traits under control unstressed and drought stress conditions (withheld water for 30 days after seedling establishment) as per RCBD with three replications using a cylinder culture method following Kashiwagi et al. (2005).

# Vector construction and generation of transgenic plants

Full-length coding sequence (741 bp) of the CabHLH10 was amplified from cDNA of a chickpea accession ICC 4958, obtained by RT-qPCR (Verso cDNA synthesis Kit, Thermo Scientific) using gene-specific primers (CabHLH10\_pBI\_Fand CabHLH10\_pBI\_R) enlisted in Supplemental Table 14. The amplicon was ligated at the Xbal and BamHI sites of the binary plant vector pBI121 (Clontech Laboratories, USA), under the control of CaMV 35S promoter. The resulting construct (35S:CabHLH10) was introduced into the Agrobacterium tumefaciens strain GV3101. The in-planta Agrobacterium-mediated transformation of chickpea Pusa 362 (desi) cotyledons/seeds was performed following previous protocols (Chakraborti et al., 2006; Das et al., 2021). The transformants were screened by PCR and RT-qPCR analysis for transgene detection and expression level, respectively. Transgenic lines with single copy transgene were detected by Southern blotting. The homozygous transgenic lines were grown till T<sub>3</sub> generation under green-house conditions and were assessed for its drought stress response.

For complementation study, seeds of the T-DNA insertion Arabidopsis mutants of bHLH10 (SALK\_046700) were obtained from the Arabidopsis Biological Resource Center (ABRC). The wild type (WT) used in this study was Arabidopsis ecotype Columbia-0. Transformation of the Arabidopsis bHLH10 mutant using the aforementioned transformed Agrobacterium strain was carried out using the floraldip method (Clough and Bent, 1998). Positive transformants were selected by plating the transformed seeds on ½ MS (Murashige and Skoog medium) supplemented with 50 mg/ml kanamycin (Kan) and further confirmed by PCR analysis using gene-specific primers. Chi-square ( $\chi^2$ ) test analysis based on segregation ratio of 3:1 was used to select transformants with single transgene copy number following Sharma et al. (2015). The homozygous transgenic lines were grown till  $T_2/T_3$  generation and were assessed for its water-deficit stress response.

# Phenotypic evaluation of transgenic chickpea and Arabidopsis

The WT (Pusa 362) and transgenic chickpea plants were assessed for their drought stress response using the soil cylinder culture (rainout shelter) following the aforesaid methods. Phenotypic evaluation of the WT, mutant, and transgenic Arabidopsis plants was performed to assess their waterdeficit stress response. Seeds (50-100) were plated on solid MS medium with 1% sucrose and grown in growth chamber at  $22 \pm 1^{\circ}$ C under continuous light (100 µmol m<sup>-2</sup>s<sup>-2</sup>). To evaluate the effect of ABA on root growth, 6-days-old WT, mutant, and transgenic seedlings were transferred to MS medium supplemented with ABA (0.5 and 1  $\mu$ M). After 8–12 days of growth, the root length (cm), and lateral root number were measured using ImageJ 1.31 v software. To impose drought stress, 3-week-old soil-grown plants were subjected to water withholding for three weeks and recovery was given for 4 d. The RCW (relative water content), survival rate, and rate of water loss of the drought-stressed versus -unstressed control soil-grown plants were measured according to Sharma et al. (2015).

#### Phenotyping for PE traits

The control unstressed and drought/ABA stress-imposed low and high DYI(P/H) NILs were phenotyped for diverse PE trait parameters, including CC (mg/g-FW), SCMR, CF (Fv/Fm), CAR-CO<sub>2</sub>↑ (µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>), and CAR-LI↑ (µmol CO<sub>2</sub>m<sup>-2</sup> s<sup>-1</sup>) as per Basu et al. (2019). Three biological replicates each with at least three technical replicates were used for phenotyping of PE traits.

### **Accession numbers**

The sequencing data have been submitted to the NCBI-sequence read archive (SRA) database (http://www. ncbi.nlm.nih.gov/sra) under accession number SRR6277501 (Submission ID: SUB3198514). All 110110 high-quality SNPs were submitted to NCBI dbSNP (http://www.ncbi.nlm.nih. gov/SNP/snp\_viewTable.cgi?handle=NIPGR) (Supplemental Table 3) for unrestricted public access. Detailed information on all major genes/proteins mentioned in this manuscript can be found in the Supplemental Tables 3 and 8 and 12.

### Supplemental data

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

**Supplemental Figure S1**. Diagram illustrating the strategies followed to develop introgression lines (ILs) and their efficacy in genome-wide integrated genomics-assisted breeding to develop drought-tolerant chickpea cultivars with enhanced yield and productivity.

**Supplemental Figure S2**. Overview of plants and mature seeds of introgression lines (ILs) developed to dissect drought-tolerance traits in chickpea.

**Supplemental Figure S3.** A genome scan plot illustrating the overall genomic density and distribution of 110110 SNPs physically mapped across eight chromosomes of *kabuli* chickpea genome.

**Supplemental Figure S4.** Genomic distribution and structural annotation of 110110 genome-wide SNPs discovered from 222 ILs (association panel) along with six high-yielding cultivated (*desi* and *kabuli*) chickpea varieties and one wild progenitor *Cicer reticulatum* accession (used as parents to develop ILs) through GBS assay.

**Supplemental Figure S5**. Determination of molecular diversity and genetic structure patterns among 222 introgression lines (ILs) in the association panel of chickpea.

**Supplemental Figure S6**. Broad phenotypic variation of major seed yield traits observed among 222 ILs in a constituted association panel of chickpea during drought stress.

**Supplemental Figure S7**. Wide phenotypic variation of major seed yield traits observed among 222 ILs in a constituted association panel of chickpea during drought stress.

**Supplemental Figure S8.** GWAS-derived Manhattan plots generated using 48167 chromosome-wise SNPs, showing the significant *P* values of genomic SNP loci associated with major seed yield traits under drought stress in chickpea.

**Supplemental Figure S9**. Summary of GWAS-derived genomic SNP loci associated with major seed yield traits under drought stress in chickpea.

**Supplemental Figure S10**. Molecular mapping of major QTLs and eQTL governing vital seed yield traits during drought stress in chickpea.

**Supplemental Figure S11**. Marker (haplotype)-assisted selection led to development of drought-tolerant lines with enhanced yield and productivity in chickpea.

**Supplemental Figure S12.** Graphical genotypes of drought-tolerant lines developed through marker (haplotype)-assisted selection in chickpea.

**Supplemental Figure S13.** Genomic distribution and constitution of 129 *CabHLH* transcription factor (TF) genes scanned and annotated from *kabuli* chickpea genome.

**Supplemental Figure S14.** High-resolution molecular mapping identified major eQTLs [*CaeqDYI(P/H)1.1*] genomic region of *CaRD22, CaCAB* protein, and basic leucine zipper (*CabZIP*) governing yield traits under drought stress in chickpea.

**Supplemental Figure S15**. Controlled environment phenotyping exhibited enhanced root morphometric trait characteristics without compensating shoot growth/development in the drought-tolerant *CabHLH10* gene haplotype-introgressed lines during drought and ABA stress.

**Supplemental Figure S16.** Phenotypic evaluation of drought-tolerant lines developed through marker (haplotype)-assisted selection for yield and productivity traits under drought stress.

**Supplemental Figure S17**. Overexpression of *CabHLH10* improves root/shoot agro-morphological trait characteristics and enhanced drought tolerance in transgenic chickpea.

**Supplemental Figure S18.** Overexpression of *CabHLH10* in *Arabidopsis bHLH10* mutant enhances drought tolerance.

**Supplemental Table S1**. An association panel constituted comprising of 222 introgression lines (ILs) along with seven accessions (used as parents to develop ILs) utilized for genetic dissection of major yield traits during drought stress in chickpea.

**Supplemental Table S2.** Summary of sequencing statistics generated through GBS of 222 introgression lines (ILs) belonging to an association panel as well as seven accessions used as parents to develop ILs of chickpea.

**Supplemental Table S3.** Structural and functional annotation of 110110 genome-wide SNPs discovered through GBS of 222 introgression lines (ILs) belonging to an association panel along with seven accessions used as parents to develop ILs of chickpea.

**Supplemental Table S4**. Descriptive statistics of major yield traits measured among 222 introgression lines (ILs) in an association panel constituted based on their multienvironment replicated field phenotyping under irrigated (unstressed) and unirrigated (drought stress) conditions.

**Supplemental Table S5**. Genomic SNP loci significantly associated with major yield traits under drought stress in chickpea.

**Supplemental Table S6.** SNPs mapped on eight chromosomes of a high-density genetic linkage map of chickpea.

**Supplemental Table S7**. Genomic constitution based on structural and functional annotation of *CabHLH* genes identified from chickpea genome.

**Supplemental Table S8.** Summary of *CabHLH10* gene of chickpea exhibiting orthologous relationship with other legumes and *Arabidopsis*.

**Supplemental Table S9.** Germplasm accessions selected for molecular haplotyping to dissect major yield traits under drought stress in chickpea.

**Supplemental Table S10**. Wild *Cicer* accessions used for molecular haplotyping to dissect major yield traits under drought stress in chickpea.

**Supplemental Table S11**. Agro-morphological traits-based phenotyping depicting variation for major root and shoot morphometric traits in the 30-days-old cylinder-soil-grown plants of drought-tolerant and sensitive near isogenic lines (NILs).

**Supplemental Table S12.** ABA-responsive candidate/ known genes controlling drought tolerance in crop plants assayed through global transcriptome sequencing used for differential expression profiling in the high- and low-DYI near isogenic lines (NILs) of chickpea.

**Supplemental Table S13.** Seed yield traits evaluated in the high- and low-DYI near isogenic lines (NILs) vis-à-vis high-yielding cultivated accessions (parents to develop ILs) of chickpea based on their multi-environment replicated field phenotyping under irrigated (unstressed) and unirrigated (drought stress) conditions.

**Supplemental Table S14**. Details of primers used in the present study for functional genomic analysis.

# Acknowledgments

We are thankful to Mr. Sube Singh, lead scientific officer, Grain Legumes Research Program/Genebank, ICRISAT, Hyderabad for assisting in collecting multi-environment field phenotyping data for the introgression lines (ILs), germplasm accessions, and mapping population. We are very grateful to all of the scientific and technical staff members of NIPGR and IARI (Indian Council of Agricultural Research), New Delhi and ICRISAT, Hyderabad who provided valuable guidance, suggestions, constant encouragement, and timely support of the research. We are also thankful to the Central Instrumentation Facility (CIF), Plant Growth Facility (PGF), and DBT-eLibrary Consortium (DeLCON) of NIPGR, New Delhi for providing timely support and access to e-resources for this study.

### Funding

Financial support for this study was provided by a research grant from the Department of Biotechnology (DBT), Ministry of Science and Technology, India (102/IFD/SAN/2161/2013-14). V.T., U.B., L.N., A.D., and J.K.M. acknowledge the UGC (University Grants Commission) and DBT, India for research fellowship awards.

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

# **Data availability**

The sequencing data have been submitted to the NCBI-sequence read archive (SRA) database (http://www. ncbi.nlm.nih.gov/sra) under accession number SRR6277501 (Submission ID: SUB3198514). All 110110 high-quality SNPs were submitted to NCBI dbSNP (http://www.ncbi.nlm.nih. gov/SNP/snp\_viewTable.cgi?handle=NIPGR) (Supplemental Table 3) for unrestricted public access. Detailed information about all of the work described in this manuscript can be found in the Supplemental Data.

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