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# Identification of the Golden-2-like transcription factors gene family in *Gossypium hirsutum*

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### ABSTRACT

**Background:** Golden2-Like (GLK) transcription factors are a type of transcriptional regulator in plants. They play a pivotal role in the plant physiological activity process and abiotic stress response.

**Methods:** In this study, the potential function of *GLK* family genes in *Gossypium hirsutum* was studied based on genomic identification, phylogenetic analysis, chromosome mapping and cis-regulatory elements prediction. Gene expression of nine key genes were analyzed by qRT-PCR experiments.

**Results:** Herein, we identified a total of 146 *GhGLK* genes in *Gossypium hirsutum*, which were unevenly distributed on each of the chromosomes. There were significant differences in the number and location of genes between the At sub-genome and the Dt sub-genome. According to the phylogenetic analysis, they were divided into ten subgroups, each of which had very similar number and structure of exons and introns. Some cis-regulatory elements were identified through promoter analysis, including five types of elements related to abiotic stress response, five types of elements related to phytohormone and five types of elements involved in growth and development. Based on public transcriptome data analysis, we identified nine key *GhGLKs* involved in salt, cold, and drought stress. The qRT-PCR results showed that these genes had different expression patterns under these stress conditions, suggesting that *GhGLK* genes played an important role in abiotic stress response. This study laid a theoretical foundation for the screening and functional verification of genes related to stress resistance of *GLK* gene family in cotton.

**Subjects** Agricultural Science, Genomics, Molecular Biology, Plant Science **Keywords** *Gossypium hirsutum*, Golden2-like, Gene family, Phylogenetic analysis, Abiotic stress

### INTRODUCTION

Transcription factors (TFs), also known as trans-acting factors, are known to activate or inhibit the transcription of downstream target genes at appropriate times. TFs affect all aspects of plant growth and development (*Song et al., 2016*; *Ling et al., 2011*). Plants are threatened by abiotic stresses during their growth, including high temperature, herbicides, heavy metals, drought, salinity, cold, pests and diseases (*Nguyen et al., 2018*). Crop yields

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#### **OPEN ACCESS**

are known to be seriously threatened under abiotic stress (*Riechmann et al., 2000; Wray et al., 2003*). Transcription factors can activate or inhibit gene transcription, affect the expression and function of their proteins, and play a significant role in plant stress response and physiological activities (*Chrispeels et al., 2000; Mizoi, Shinozaki & Yamaguchi-Shinozaki, 2012*).

For the first time, Golden2 (G2) has been identified that could cause maize to turn yellow (*Jenkins, 1926*). Subsequently, some studies have revealed that G2 protein was an important transcription factor in plant growth and development (*Hall et al., 1998*). Golden2-Like (GLK) transcription factors are members of the *GARP* superfamily (*Riechmann et al., 2000; Xiao et al., 2019*). Most *GLK* genes contain a Myb-DNA binding domain (which contains an HLH motif) and a C-terminal (GCT) box (*Liu et al., 2017*). In addition, some members of subgroups have conserved MYB-CC-LHEQLE domains (*Qin et al., 2021*).

GLK genes have been identified with different function in Physcomitrella patens, Arabidopsis thaliana, Oryza sativa, Capsicum annuum L. and Solanum lycopersicum (Hall et al., 1998; Rossini et al., 2001; Fitter et al., 2002; Waters et al., 2009; Yasumura, Moylan & Langdale, 2005). In terms of cell differentiation, functional redundancy of the GLKs is present in A. thaliana and rice (Chen et al., 2016). In corn, ZmGLK1 and ZmGLK2, a pair of homologous genes, have basically the same function and are expressed in mesophyll cells and vascular bundle sheath cells, respectively (Chang et al., 2012). These results indicate that GLKs are expressed differently in different photosynthetic cells, which control the process of cell differentiation and play an important role in chloroplast development (Yasumura, Moylan & Langdale, 2005). Studies have indicated that GLK1 is mainly expressed in leaf tissue and GLK2 is mainly expressed in fruit (Chen et al., 2016). In tomato, SlGLK2 is only expressed in the fruit, and changes the content of sugar and carotenoid by regulating chloroplast development, thus affecting the fruit quality of tomato (Powell et al., 2012; Nguyen et al., 2014). In addition, some studies have found that the KNOTTED1-LIKE HOMEOBOX (KNOX) gene acts on the downstream of SlGLK2 and only affects the chloroplast development in tomato fruit but not in leaf tissue (Nadakuduti et al., 2014). All these indicate that although GLK1 and GLK2 have the same function, they have different regulatory pathways in different organs and have tissue-specific characteristics (Nguyen et al., 2014). GLKs may enrich the carbon utilization rate of plants to a certain extent and promote the growth and exploitation of plants by increasing the fixation of carbon dioxide in root (Kobayashi et al., 2012). However, the expression of GLKs in leaves was significantly higher than that in roots (Fitter et al., 2002).

The *GLKs* also play an important role in biotic stress. At present, studies on *GLKs* in plant disease resistance mainly focus on *A. thaliana*, a model system, and some studies on rice, while few studies are known on other crops (*Chen et al., 2016*). The overexpression of *AtGLK1* enhances the resistance of *A. thaliana* infected with *Fusarium graminearum*, and plays a positive role in the tolerance to *Cucumber Mosaic Virus* (*Savitch et al., 2007; Schreiber et al., 2011; Han et al., 2016*). AtGLK1 regulates genes related to disease resistance, and its effect on different pathogens are different (*Chen et al., 2016*). In addition to *A. thaliana*, *OsGLK1* in rice has also shown certain disease resistance (*Nakamura et al., 2016*).

2009). In addition, *GLKs* are also involved in hormonal response. The resistance of *AtGLK1* to *Hyalo-peronospora arabidopsidis* Noco2 involves two signaling pathways: salicylic acid and jasmonic acid (*Murmu et al., 2014*). The *GLK1/2-WRKY40* transcription module plays a negative regulatory role in the ABA response (*Ahmad et al., 2019*).

Many functions of *GLK* genes have been studied in depth, but the functions related to abiotic stress are rarely mentioned and few studies have been reported. Research has found that some genes in the *GLK* gene family are involved in stress response in maize (*Liu et al.*, 2016). It was found that the down-regulation of the *SlGLK29* gene in tomato could reduce the cold resistance (*Liu*, 2018). This suggests that different *GLK* genes have distinct expression patterns under different stress condition.

Cotton is an important fiber and oil crop in the world, but its development is always threatened by abiotic stresses, including extreme temperature, drought and salt (*Zhang et al.*, 2018; *Li et al.*, 2021). These stresses will become more severe in the future, which will lead to lower crop yields and quality (*Onaga & Wydra*, 2016). Therefore, it is necessary to identify genes related to abiotic stress resistance to assist cotton genetic improvement. So far, the identification of the *GLK* gene family in *G. hirsutum* has not been reported. In our research, the *GLK* gene family in *G. hirsutum* was identified, and the subcellular localization, chromosomal distribution, gene structure and expression level of *GLK* genes were analyzed. The results demonstrate that nine key genes responded to drought, salt and cold stress. This study provides a reference for further study of the role of *GLKs* in the stress response of cotton.

### **MATERIALS & METHODS**

### Identification of the GLK genes in Gossypium hirsutum

The genome files of G. hirsutum (TM-1 HAU\_v1.1) and Theobroma cacao L. (assembly Criollo\_cocoa\_genome\_V2) were obtained from CottonFGD (http://www.cottonfgd.org/) (Wang et al., 2019) and NCBI (https://www.ncbi.nlm.nih.gov/) (Argout et al., 2011). The genome and protein sequences of A. thaliana were obtained from NCBI (https://www. ncbi.nlm.nih.gov/). The Markov Model (HMM) of PF00249.31 and PF14379.6 were downloaded from Pfam (https://pfam.xfam.org/). The TBtools v1.087 HMM Search (Chen et al., 2020) was used to identify the GLK gene family in A. thaliana, G. hirsutum and T. cacao with PF00249.31 and PF14379.6, which were most likely members of GLK gene family. Published tomato GLK protein sequences were downloaded from NCBI (https:// www.ncbi.nlm.nih.gov/) (Liu, 2018). The A. thaliana and tomato sequences were used as query sequences to BLAST against the cotton and T. cacao genome database using TBtools (Chen et al., 2020). ProtParam tool (https://web.expasy.org/protparam/) was used to predict the physical and chemical properties of GLK proteins, including the number of amino acids, molecular weight (MW), isoelectric point (PI), and Instability index. The subcellular localization of GLKs was predicted through the WoLF PSORT (https:// wolfpsort.hgc.jp/) and CELLO v.2.5 (http://cello.life.nctu.edu.tw/) resources (Yu et al., 2006).

### Phylogenetic analysis of GLK genes

A phylogenetic tree was constructed the obtained GLK protein sequences of *A. thaliana*, tomato, *T. cacao* and *G. hirsutum*. A neighbor-joining tree of *GLK* genes was constructed using MEGA-X with 1,000 bootstrap replications (*Hall, 2013*). The phylogenetic tree was drawn using EvolView (*He et al., 2016*).

### Analysis of the conserved motifs and gene structure

The conserved sequences of *GLK* was identified and analyzed by the MEME website (http://meme-suite.org/) (*Bailey et al., 2009*). The optimal width was 10 to 150, and the number of motifs was 26. Everything else was set to default values. TBtools (*Chen et al., 2020*) was used to map conserved motifs and gene structures (introns and exons), using MAST profiles from the MEME website and the GFF3 profiles for each gene.

### Chromosomal localization analysis of GLK genes

Based on the genome and genome annotation files of *G. hirsutum*, the chromosome distribution of *GLK* genes and their physical locations were obtained through TBtools (*Chen et al., 2020*).

### Cis-regulatory elements analysis of GLK

In order to analyze the promoter of *GLK* in *G. hirsutum* and predict the function of the *GLK* genes, 2,000 bp sequence upstream of the start codon for each gene was extracted and input into the Plantcare website for analysis (http://bioinformatics.psb.ugent.be/webtools/plantcare/html/).

#### GO and KEGG enrichment analysis of GLK genes

For functional enrichment analysis, *GhGLKs* were submitted to the omicshare tool (https://www.omicshare.com/tools/) for GO and KEGG enrichment analysis.

### Differential gene expression analysis

In order to study the expression pattern of the *GLK* in *G. hirsutum*, the transcriptome sequencing data of *G. hirsutum* (PRJNA490626) under cold, salt, and drought stress was downloaded from NCBI (https://www.ncbi.nlm.nih.gov/). Trimmomatic (*Bolger, Lohse & Usadel, 2014*) was used to remove the adapter and perform quality control. Reads were mapped to the genome using the hisat2 program (*Kim, Langmead & Salzberg, 2015*), and then Fragments Per Kilobase of transcript per Million fragments (FPKM) values of *GLK* genes were calculated by Cufflinks (*Ghosh & Chan, 2016*; *Pollier, Rombauts & Goossens, 2013*). The expression level of *GLK* family genes was standardized, expressed as a FPKM value, and transformed in  $log_2$  form, and the heatmap was drawn using TBtools software (*Chen et al., 2020*).

#### Stress treatments and qRT-PCR analysis

*G. hirsutum* acc. TM-1 planted in the experimental field of Anyang Institute of Technology was selected as experimental material. The seedlings with stable growth of *G. hirsutum* were treated with three stresses: salt stress, drought stress and cold stress. The root of

cotton seedlings was irrigated with 250 mM NaCl solution and 18% PEG solution to simulate salt stress and drought stress. It was placed in a 4 °C incubator to simulate cold stress treatment. Leaves from cotton seedlings with consistent growth were collected after 0, 1, 3, 6, 12, 24 h of above stresses. All samples were immediately frozen in liquid nitrogen and stored at -80 °C for RNA extraction.

Total RNA was extracted from each sample using the EASYspin Plus Plant RNA Kit (RN38, Aidlab Biotech, Beijing, China). The quality of RNA was determined by agarose gel electrophoresis and a Nanodrop2000 nucleic acid analyzer. The cDNAs were synthesized using a TranScript All-in-One First-Strand cDNA Synthesis SuperMix for qPCR (Transgen Biotech, Beijing, China). The kit used for Real-time PCR was the TransStart Top Green qPCR SuperMix kit (Transgen Biotech, Beijing, China). The instrument used was the ABI 7500 Fast Real-Time PCR system (Applied Biosystems, Waltham, MA, USA). The specific primers for these differentially expressed genes were designed using the Prime-Blast in the NCBI online database and were listed in Table S1. Each experiment was repeated three times, and chose two groups of good data to graph. The relative gene expression levels were analyzed using the  $2^{-\Delta\Delta Ct}$  method (*Livak & Schmittgen*, 2001).

## RESULTS

# Identification and analysis of basic physicochemical properties of *GLK* family members in *G. hirsutum*

A total of 146 *GLK* genes were identified from *G. hirsutum*, named *GhGLK1-GhGLK146*. The basic physical and chemical properties were also predicted and analyzed. Amino acid sequences range in length was from 140 (*GhGLK27*) to 826 (*GhGLK139*), the isoelectric point was from 5.07 (*GhGLK9*) to 9.71 (*GhGLK134*). The instability index refers to how stable the protein was in the test tube ( $\leq$ 40, possibly stable; >40, possibly unstable). Prediction showed that, except for 13 genes, all other genes may be stable. According to the results of subcellular localization, all the *GhGLK* genes were located in the nucleus. *GhGLK6*, *GhGLK46*, *GhGLK76*, *GhGLK128* and *GhGLK139* were located in the chloroplast and nucleus. *GhGLK112* and *GhGLK127* were in cytoplasm and nucleus (Table S2).

### Phylogenetic analysis of GLK in G. hirsutum

Using tomato, *A. thaliana* and *T. cacao* GLK protein sequences as reference, a rootless phylogenetic tree of GLK protein in *G. hirsutum* was constructed (Fig. 1). As the results shown, 146 *GLK* genes of *G. hirsutum* were divided in 10 subfamilies. At the same time, the number of *GLKs* in *G. hirsutum* was much higher than that in *A. thaliana*, *T. cacao* and tomato.

# Gene structure and protein conserved motif analysis of *GLK* in *G. hirsutum*

The motif of each protein, namely the conserved element, was analyzed by MEME. A total of 26 possible motifs were identified. Motif 1 was included in all *GhGLKs*, and it was conservative for *GhGLKs*. These motifs differ between subfamilies, but were conserved within each subfamily. For example, motifs 17 and 18 were found only in subfamily D and



**Figure 1** Phylogenetic analysis of *GLK* proteins from *Gossypium hirsutum*, *Theobroma cacao* L, tomato and *Arabidopsis thaliana*. The blue marks are members of the tomato *GLK* family; The green circles are members of the *A. thaliana GLK* family; The purple squares are members of the *T. cacao GLK* family; The yellow star is the *GLK* member of cotton subgroup A, and the red triangle is the D subgroup. The blue squares are *GLK* genes located on the scaffolds. Full-size DOI: 10.7717/peerj.12484/fig-1

E, respectively. Some subfamilies had very conservative motifs. For example, all members of the C subfamily had motif 5, 3, 8, 2, 1, 14, 10. Predictions about exons and introns of the *GLK* genes were shown in the Fig. 2. The number of exons was at least one and at most eleven. Except for *GhGLK87*, the other members of the D subfamily had one exon, and all members of the C subfamily had 11 exons. Most of the other members had between 4 and 7 introns. The number of exons and introns varied among different subfamilies, but in the same subfamily, the exon-intron structure of most members showed great similarity.

### Chromosomal localization analysis of GLK family genes in G. hirsutum

Based on a physical map of the *GLK* family members of *G. hirsutum*, 144 of 146 *GLK* genes were located on 26 chromosomes (Fig. 3). The other two genes were located on the scaffold. Among the chromosome-located genes, 17 genes were located on chromosome 5. There were 16 genes located on chromosomes 8 and 12, only six genes were located on chromosome 2 (Fig. 4). There were significant differences in At sub-genome and Dt sub-genome about the number and location of genes. For example, there were two genes on chromosome A02 and four genes on chromosome D02. This may be due to the fact that



Figure 2 The conserved motif and exon-intron structure of *GLK* genes in *Gossypium hirsutum*. (A) Phylogenetic analysis of *GhGLK* genes. (B) Analysis of conserved motif of *GhGLK* protein sequences. Different motifs are shown in a specific color. (C) Intron and exon analysis of *GhGLK* genes. Exons and introns are represented by yellow boxes and thin lines, respectively. The UTR is shown in a green box. Full-size  $\square$  DOI: 10.7717/peerj.12484/fig-2

*G. hirsutum* is a tetraploid cotton species, which is a hybrid between an A-genome-like *Gossypium herbaceum* and a D-genome-like *Gossypium raimondii*.

### Analysis of promoters of GLK genes

The Plantcare was used to analyze the sequence of 2,000 bp upstream of the promoter region of *GhGLK* genes, and the found cis-regulatory elements were shown in Fig. 5.



Figure 3 Chromosome distribution statistics of GhGLK genes. Blue represents the number of geneslocate on each chromosome of subgroup A, while red represents the number of genes locate on eachchromosome of subgroup D.Full-size DOI: 10.7717/peerj.12484/fig-3



on scaffold. Chromosome names are shown on the left and gene names are shown on the right. Full-size DOI: 10.7717/peerj.12484/fig-4

We found several cis-regulatory elements in stress response, which were associated with anaerobic induction, defense and stress response, drought, cold, and wound, respectively. Meanwhile, we also found a number of hormone-responsive cis-regulatory elements,





**Figure 5** Analysis of cis-regulatory elements in promoters of *GhGLK* genes (A–J). Cis-regulatory elements with the same function are shown in the same color. Full-size DOI: 10.7717/peerj.12484/fig-5

which were associated with abscisic acid (ABA), auxin (IAA), gibberellin (GA), salicylic acid (SA), and methyl jasmonate (MeJA). Among all cis-regulatory elements, the number of elements related to light response was the largest and the distribution was the widest. In addition, we had identified cis-regulatory elements involved in cell cycle regulation,



**Figure 6 GO and KEGG enrichment analysis of** *GhGLKs.* (A) The numbers of level2 GO terms. (B) KEGG pathway enrichment analysis of *GhGLKs.* Full-size DOI: 10.7717/peerj.12484/fig-6

circadian rhythm, down regulation of photosin expression, and regulation of flavonoid biosynthesis genes. In summary, different types and quantities of cis-regulatory elements were distributed in different *GhGLK* promoters of cotton. According to the results, it was speculated that under environmental stress, the cis-regulatory elements leaded to the expression of *GhGLK* genes, thereby enhancing the resistance to environmental stress.

### GO and KEGG enrichment analysis of GLK in G. hirsutum

In order to further understand the function of *GhGLKs*, we carried out functional enrichment annotation of gene ontology (GO) and kyoto encyclopedia of genes and genomes (KEGG). The results improved our accurate understanding of gene function, including many significantly enriched terms (Fig. 6, Table S2). The GO enrichment analysis of *GhGLKs* was divided into three categories, including biological processes, molecular functions and cellular components, of which the biological process had the largest number of 13 GO entries, followed by molecular functions and cellular components. The biological process was mainly concentrated in four subclasses: cellular process, metabolic process, regulation of biological process and biological regulation.





The molecular function mainly included binding, nucleic acid binding transcription factor activity and catalytic activity. The cellular components were mainly organelle subclasses. KEGG pathway enrichment analysis of *GLK* family genes revealed two pathways, RNA transport and plant hormone signal transduction respectively. To sum up, the functional enrichment analysis results confirmed the functions of *GhGLKs* in many biological processes, which were related to plant growth and development, plant hormone signal transduction and so on.

# Expression analysis of *GLK* gene in *G. hirsutum* under different abiotic stresses

To investigate the response of *GhGLK* to adversity stress, we analyzed the expression levels of 146 *GhGLKs* under different adversity conditions. The results showed that the expression of *GhGLK* genes altered under salt, drought and cold stress, which revealed that *GhGLKs* were involved in the regulation of adversity stress (Fig. 7). According to the above



(A) Expression patterns of *GhGLKs* under salt stress. (B) Expression patterns analysis of *GhGLKs* under drought stress. (C) Expression patterns analysis of *GhGLKs* under cold stress. Full-size ▲ DOI: 10.7717/peerj.12484/fig-8

results, we selected nine key genes with differentially expressed *GhGLKs* and analyzed the expression pattern by qRT-PCR (Fig. 8).

Under salt stress, the expression levels of all *GhGLK* genes increased after 1 h, reached a minimum at 12 h, and increased again at 24 h. Among them, the expression levels of *GhGLK38*, *GhGLK55*, *GhGLK82*, and *GhGLK120* increased significantly at a certain moment, reaching the highest level at 1, 24, 6, and 1 h respectively. Except for *GhGLK1*, *GhGLK39* and *GhGLK82*, other genes increased after 1 h of treatment, then continued to decline, and increased again after 24 h. These genes had a certain trend under salt stress treatment, and the response to salt stress was more obvious, and the expression of genes also had certain differences.

Under drought stress, *GhGLK1*, *GhGLK8*, and *GhGLK120* genes were significantly down-regulated after 1 h of treatment, and their expression levels were extremely low, indicating that these genes may play a negative regulatory role under drought stress. *GhGLK46* and *GhGLK55* genes changed significantly, both were up-regulated after 1 h of treatment and reached a peak at 3 h, decreased after 6 h, and then continued to increase. There was no significant change in the expression levels of the two genes *GhGLK39* and *GhGLK47*.

Under cold stress, all *GhGLK* genes were significantly lower than that under drought stress and salt stress, which indicated that *GhGLK* genes were not strongly induced by low temperature stress. Except for *GhGLK8*, *GhGLK38*, *GhGLK82* and *GhGLK120*, the other genes were up-regulated after 1 h of low temperature treatment. *GhGLK55* was strongly induced by cold stress, and its expression continued to increase, reaching a peak at 3 h and beginning to decrease. *GhGLK38* reached the lowest after 12 h of cold stress treatment, *GhGLK39* and *GhGLK82* reached the lowest at 3 and 1 h, respectively, and all other *GhGLKs* reached the lowest at 24 h.

### DISCUSSION

As the main cultivated cotton species in the world, *G. hirsutum* is extremely important to human life. Adversity coercions, including drought, salt and cold, are a very serious problem to plant growth and development. Golden2-Like is a type of transcription factor that exists widely in plants, and belongs to an important type of transcription factor in the GARP transcription factor superfamily of Myb transcription factors. It had been identified in many species and found to be closely related to abiotic stress, but it had not been reported in cotton.

Herein, a total of 146 *GLKs* were identified from *G. hirsutum*, named each gene according to its position on the chromosome. The number of *GLK* gene in cotton was much higher than that in tomato (54 genes) (*Liu*, 2018) and maize (59 genes) (*Liu et al.*, 2016), which might be related to the relatively large genome of *G. hirsutum* heterotetraploid and the complexity of gene regulationdue to the complexity of the genome. The analysis of the physical and chemical properties of upland cotton *GhGLK* showed that its sequence length, relative molecular weight and isoelectric point distribution range were very large. This might be due to the large-scale replication of the upland cotton genome and the large number of upland cotton *GhGLK* genes. This study predicted the location of *G. hirsutum GLKs* in the cell, and found that some genes were located in the chloroplast. Previous studies had shown that the *GLK* gene is related to the growth and development of the chloroplast. This result was also consistent with the results of previous studies.

We analyzed the phylogenetic relationship of *G. hirsutum GLKs*, and constructed a phylogenetic tree of tomato, *A. thaliana* and *G. hirsutum*. The results showed that the *GLK* gene of *G. hirsutum* can be divided into 11 subfamilies, while tomato and corn were divided into six subfamilies (*Liu*, 2018). This might be due to the fact that the number of *GLK* genes in cotton was larger than that of *GLK* in tomato, resulting in a more precise and accurate sub-family classification. Some *GhGLK* and tomato *GLK* were homologous, and the results of this study indicated that there was a close evolutionary relationship between *GLK* genes. At the same time, we found that *GhGLK* gathered in the same subfamily had similar motif distribution patterns, motif positions and lengths.

The gene structure analysis also showed that the GLK gene had strong evolutionary conservation. GLK genes in the same subgroup had similar number of exons/introns and length of exons. The results of previous studies showed that the structure of the exons and introns of each subfamily of GLK genes in tomato showed a large similarity, and the number of introns of most members was between 4 and 7. The results were the same in *G. hirsutum*, except that there are up to 11 exons in upland cotton and up to seven in tomato (*Liu*, 2018).

In the *G. hirsutum GLK* gene family, 144 genes were located on 26 chromosomes of group A and D, and the other two genes were located on scaffolds of unknown chromosomes. Among them, there were 70 *GLK* genes on chromosomes of group A and chromosomes of group D. There were 74 *GLK* genes on it. The distribution of the *GLK* gene in *G. hirsutum* was uneven on the chromosomes, but the distribution of the *GLK* gene on the two homologous chromosomes was indeed the same.

Many cis-elements in *GhGLK* promoter were related to biotic and abiotic stress. In order to further understand the function of *GhGLK* under different environmental stresses, we analyzed the expression patterns of nine GhGLK under different environmental stresses by qRT-PCR. This showed that most selected GhGLKs respond to abiotic stresses, including drought, cold, and salt. In previous studies, it was found that the expression pattern of ZmGLK3 gene in maize was up-regulated under drought and salt stress (Liu et al., 2016); the expression of SlGLK7 in tomato was up-regulated under three stresses (Liu, 2018). The expression of SIGLK15 and SIGLK37 genes in tomato decreased first and then increased during cold stress and salt stress, and these two genes belonged to the same subfamily (*Liu*, 2018). In our results, we found that the two genes GhGLK55and GhGLK120 were located in the same subgroup, and they were in the same subgroup as SIGLK15 and SIGLK37 in tomato. These two genes in G. hirsutum also decreased firstly and then increased under cold and salt stress, indicating that the orthologous genes they should have similar expression patterns in the face of adversity and coercion. We also found that the differentially expressed genes all have anaerobic-induced and light-responsive cis-acting elements, and they all contained at least one abiotic stress-responsive element. GhGLK120 had the most hormone-responsive elements.

# **CONCLUSIONS**

In this study, 146 *GhGLK* genes were identified in *G. hirsutum*. Based on the analysis of their physical and chemical properties, subcellular localization, phylogenetic relationship, distribution of cis-regulatory elements, we identified nine key *GhGLKs* involved in salt, cold, and drought stress. The qRT-PCR results of these genes in three stress responses showed that *GhGLKs* played an important role in abiotic stress responses in cotton. It was of great significance to make full use of its resistance germplasm resources and provided a theoretical basis for further mining of cotton resistance genes.

### **ADDITIONAL INFORMATION AND DECLARATIONS**

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### **Competing Interests**

The authors declare that they have no competing interests.

### **Author Contributions**

- Zilin Zhao conceived and designed the experiments, performed the experiments, analyzed the data, prepared figures and/or tables, authored or reviewed drafts of the paper, and approved the final draft.
- Jiaran Shuang performed the experiments, analyzed the data, prepared figures and/or tables, and approved the final draft.
- Zhaoguo Li performed the experiments, analyzed the data, prepared figures and/or tables, and approved the final draft.
- Huimin Xiao performed the experiments, analyzed the data, prepared figures and/or tables, and approved the final draft.
- Yuling Liu performed the experiments, analyzed the data, authored or reviewed drafts of the paper, and approved the final draft.
- Tao Wang analyzed the data, authored or reviewed drafts of the paper, and approved the final draft.
- Yangyang Wei analyzed the data, authored or reviewed drafts of the paper, and approved the final draft.
- Shoulin Hu analyzed the data, prepared figures and/or tables, and approved the final draft.
- Sumei Wan conceived and designed the experiments, authored or reviewed drafts of the paper, and approved the final draft.
- Renhai Peng conceived and designed the experiments, authored or reviewed drafts of the paper, and approved the final draft.

### **Data Availability**

The following information was supplied regarding data availability: The raw data are available in the Supplemental File.

### **Supplemental Information**

Supplemental information for this article can be found online at http://dx.doi.org/10.7717/ peerj.12484#supplemental-information.

### REFERENCES

- Ahmad R, Liu Y, Wang TJ, Meng Q, Yin H, Wang X, Wu Y, Nan N, Liu B, Xu ZY. 2019. GOLDEN2-LIKE transcription factors regulate WRKY40 expression in response to abscisic acid. *Plant Physiology* **179(4)**:1844–1860 DOI 10.1104/pp.18.01466.
- Argout X, Salse J, Aury JM, Guiltinan MJ, Droc G, Gouzy J, Allegre M, Chaparro C, Legavre T, Maximova SN, Abrouk M, Murat F, Fouet O, Poulain J, Ruiz M, Roguet Y, Rodier-Goud M, Barbosa-Neto JF, Sabot F, Kudrna D, Ammiraju JS, Schuster SC, Carlson JE, Sallet E, Schiex T, Dievart A, Kramer M, Gelley L, Shi Z, Bérard A, Viot C, Boccara M, Risterucci AM, Guignon V, Sabau X, Axtell MJ, Ma Z, Zhang Y, Brown S, Bourge M, Golser W, Song X, Clement D, Rivallan R, Tahi M, Akaza JM, Pitollat B, Gramacho K, D'Hont A, Brunel D, Infante D, Kebe I, Costet P, Wing R, McCombie WR, Guiderdoni E, Quetier F, Panaud O,

Wincker P, Bocs S, Lanaud C. 2011. The genome of Theobroma cacao. *Nature Genetics* 43(2):101–108 DOI 10.1038/ng.736.

- Bailey TL, Boden M, Buske FA, Frith M, Grant CE, Clementi L, Ren J, Li WW, Noble WS. 2009. MEME SUITE: tools for motif discovery and searching. *Nucleic Acids Research* 37(ue)):W202–W208 DOI 10.1093/nar/gkp335.
- Bolger AM, Lohse M, Usadel B. 2014. Trimmomatic: a flexible trimmer for Illumina sequence data. *Bioinformatics* 30(15):2114–2120 DOI 10.1093/bioinformatics/btu170.
- Chang YM, Liu WY, Shih AC, Shen MN, Lu CH, Lu MY, Yang HW, Wang TY, Chen SC, Chen SM, Li WH, Ku MS. 2012. Characterizing regulatory and functional differentiation between maize mesophyll and bundle sheath cells by transcriptomic analysis. *Plant Physiology* 160(1):165–177 DOI 10.1104/pp.112.203810.
- Chen C, Chen H, Zhang Y, Thomas HR, Frank MH, He Y, Xia R. 2020. TBtools: an integrative toolkit developed for interactive analyses of big biological data. *Molecular Plant* 13(8):1194–1202 DOI 10.1016/j.molp.2020.06.009.
- Chen M, Ji M, Wen B, Liu L, Li S, Chen X, Gao D, Li L. 2016. GOLDEN 2-LIKE transcription factors of plants. *Frontiers in Plant Science* 7(272):1509 DOI 10.3389/fpls.2016.01509.
- Chrispeels HE, Oettinger H, Janvier N, Tague BW. 2000. AtZFP1, encoding Arabidopsis thaliana C2H2 zinc-finger protein 1, is expressed downstream of photomorphogenic activation. *Plant Molecular Biology* 42(2):279–290 DOI 10.1023/a:1006352809700.
- Fitter DW, Martin DJ, Copley MJ, Scotland RW, Langdale JA. 2002. *GLK* gene pairs regulate chloroplast development in diverse plant species. *The Plant Journal* **31(6)**:713–727 DOI 10.1046/j.1365-313x.2002.01390.x.
- Ghosh S, Chan CK. 2016. Analysis of RNA-Seq data using TopHat and Cufflinks. *Methods in Molecular Biology* 1374(2):339–361 DOI 10.1007/978-1-4939-3167-5\_18.
- Hall BG. 2013. Building phylogenetic trees from molecular data with MEGA. *Molecular Biology Evolution* 30(5):1229–1235 DOI 10.1093/molbev/mst012.
- Hall LN, Rossini L, Cribb L, Langdale JA. 1998. GOLDEN 2: a novel transcriptional regulator of cellular differentiation in the maize leaf. *Plant Cell* 10(6):925–936 DOI 10.1105/tpc.10.6.925.
- Han XY, Li PX, Zou LJ, Tan WR, Zheng T, Zhang DW, Lin HH. 2016. GOLDEN2-LIKE transcription factors coordinate the tolerance to Cucumber mosaic virus in Arabidopsis. *Biochemical and Biophysical Research Communications* 477(4):626–632 DOI 10.1016/j.bbrc.2016.06.110.
- He Z, Zhang H, Gao S, Lercher MJ, Chen WH, Hu S. 2016. Evolview v2: an online visualization and management tool for customized and annotated phylogenetic trees. *Nucleic Acids Research* 44(W1):W236–W241 DOI 10.1093/nar/gkw370.
- Jenkins MT. 1926. A second gene producing golden plant color in maize. *The American Naturalist* 60(670):484–488 DOI 10.1086/280119.
- Kim D, Langmead B, Salzberg SL. 2015. HISAT: a fast spliced aligner with low memory requirements. *Nature Methods* 12(4):357–360 DOI 10.1038/nmeth.3317.
- Kobayashi K, Baba S, Obayashi T, Sato M, Toyooka K, Keränen M, Aro EM, Fukaki H, Ohta H, Sugimoto K, Masuda T. 2012. Regulation of root greening by light and auxin/cytokinin signaling in *Arabidopsis. Plant Cell* 24(3):1081–1095 DOI 10.1105/tpc.111.092254.
- Li Z, Liu Z, Wei Y, Liu Y, Xing L, Liu M, Li P, Lu Q, Peng R. 2021. Genome-wide identification of the MIOX gene family and their expression profile in cotton development and response to abiotic stress. *PLOS ONE* 16(7):e0254111 DOI 10.1371/journal.pone.0254111.

- Ling J, Jiang W, Zhang Y, Yu H, Mao Z, Gu X, Huang S, Xie B. 2011. Genome-wide analysis of WRKY gene family in Cucumis sativus. BMC Genomics 12(1):471 DOI 10.1186/1471-2164-12-471.
- **Liu JF. 2018.** Bioinformatics analysis of tomato G2-like transcription factor family and identification of resistance-related genes. D. Agriculture. Thesis. College of Horticulture & Landscape Architecture.
- Liu F, Xu Y, Han G, Zhou L, Ali A, Zhu S, Li X. 2016. Molecular evolution and genetic variation of G2-like transcription factor genes in maize. *PLOS ONE* 11(8):e0161763 DOI 10.1371/journal.pone.0161763.
- Liu JF, Zhang J, Li H, Zhao TT, Li JF. 2017. Research progress of plant GOLDEN2-Like transcription factor. *Fenzi Zhiwu Yuzhong (Molecular Plant Breeding)* 15(10):3949–3956 DOI 10.13271/j.mpb.015.003949.
- Livak KJ, Schmittgen TD. 2001. Analysis of relative gene expression data using real-time quantitative PCR and the 2 (-Delta Delta C(T)) Method. *Methods* 25(4):402–408 DOI 10.1006/meth.2001.1262.
- Mizoi J, Shinozaki K, Yamaguchi-Shinozaki K. 2012. AP2/ERF family transcription factors in plant abiotic stress responses. *Biochimica Et Biophysica Acta* 1819(2):86–96 DOI 10.1016/j.bbagrm.2011.08.004.
- Murmu J, Wilton M, Allard G, Pandeya R, Desveaux D, Singh J, Subramaniam R. 2014. Arabidopsis GOLDEN2-LIKE (GLK) transcription factors activate jasmonic acid (JA)dependent disease susceptibility to the biotrophic pathogen Hyaloperonospora arabidopsidis, as well as JA-independent plant immunity against the necrotrophic pathogen Botrytis cinerea. *Molecular Plant Pathology* **15(2)**:174–184 DOI 10.1111/mpp.12077.
- Nadakuduti SS, Holdsworth WL, Klein CL, Barry CS. 2014. *KNOX* genes influence a gradient of fruit chloroplast development through regulation of GOLDEN2-LIKE expression in tomato. *The Plant Journal* 78(6):1022–1033 DOI 10.1111/tpj.12529.
- Nakamura H, Muramatsu M, Hakata M, Ueno O, Nagamura Y, Hirochika H, Takano M, Ichikawa H. 2009. Ectopic overexpression of the transcription factor *OsGLK1* induces chloroplast development in non-green rice cells. *Plant Cell Physiology* **50(11)**:1933–1949 DOI 10.1093/pcp/pcp138.
- Nguyen HC, Lin KH, Ho SL, Chiang CM, Yang CM. 2018. Enhancing the abiotic stress tolerance of plants: from chemical treatment to biotechnological approaches. *Plant Physiology* 164(4):452–466 DOI 10.1111/ppl.12812.
- Nguyen CV, Vrebalov JT, Gapper NE, Zheng Y, Zhong S, Fei Z, Giovannoni JJ. 2014. Tomato GOLDEN2-LIKE transcription factors reveal molecular gradients that function during fruit development and ripening. *Plant Cell* 26(2):585–601 DOI 10.1105/tpc.113.118794.
- **Onaga G, Wydra K. 2016.** Advances in plant tolerance to abiotic stresses. Plant genomics. *Available at http://dx.doi.org/10.5772/64350.*
- Pollier J, Rombauts S, Goossens A. 2013. Analysis of RNA-Seq data with TopHat and Cufflinks for genome-wide expression analysis of jasmonate-treated plants and plant cultures. *Methods in Molecular Biology* 1011:305–315 DOI 10.1007/978-1-62703-414-2\_24.
- Powell AL, Nguyen CV, Hill T, Cheng KL, Figueroa-Balderas R, Aktas H, Ashrafi H, Pons C, Fernández-Muñoz R, Vicente A, Lopez-Baltazar J, Barry CS, Liu Y, Chetelat R, Granell A, Van Deynze A, Giovannoni JJ, Bennett AB. 2012. Uniform ripening encodes a golden 2-like transcription factor regulating tomato fruit chloroplast development. *Science* 336(6089):1711–1715 DOI 10.1126/science.1222218.

- Qin M, Zhang B, Gu G, Yuan J, Yang X, Yang J, Xie X. 2021. Genome-wide analysis of the G2like transcription factor genes and their expression in different senescence stages of tobacco (Nicotiana tabacum L.). *Frontiers in Genetics* **31(12)**:626352 DOI 10.3389/fgene.2021.626352.
- Riechmann JL, Heard J, Martin G, Reuber L, Jiang C, Keddie J, Adam L, Pineda O, Ratcliffe OJ, Samaha RR, Creelman R, Pilgrim M, Broun P, Zhang JZ, Ghandehari D, Sherman BK, Yu G. 2000. Arabidopsis transcription factors: genome-wide comparative analysis among eukaryotes. Science 290(5499):2105–2110 DOI 10.1126/science.290.5499.2105.
- Rossini L, Cribb L, Martin DJ, Langdale JA. 2001. The maize *golden2* gene defines a novel class of transcriptional regulators in plants. *Plant Cell* **13**(5):1231–1244 DOI 10.1105/tpc.13.5.1231.
- Savitch LV, Subramaniam R, Allard GC, Singh J. 2007. The GLK1 'regulon' encodes disease defense related proteins and confers resistance to Fusarium graminearum in Arabidopsis. Biochemical and Biophysical Research Communications 359(2):234–238 DOI 10.1016/j.bbrc.2007.05.084.
- Schreiber KJ, Nasmith CG, Allard G, Singh J, Subramaniam R, Desveaux D. 2011. Found in translation: high-throughput chemical screening in *Arabidopsis thaliana* identifies small molecules that reduce Fusarium head blight disease in wheat. *Molecular Plant-Microbe Interactions* **24(6)**:640–648 DOI 10.1094/MPMI-09-10-0210.
- Song A, Wu D, Fan Q, Tian C, Chen S, Guan Z, Xin J, Zhao K, Chen F. 2016. Transcriptomewide identification and expression profiling analysis of chrysanthemum trihelix transcription factors. *International Journal of Molecular Sciences* 17(2):198 DOI 10.3390/ijms17020198.
- Wang M, Tu L, Yuan D, Zhu D, Shen C, Li J, Liu F, Pei L, Wang P, Zhao G, Ye Z, Huang H, Yan F, Ma Y, Zhang L, Liu M, You J, Yang Y, Liu Z, Huang F, Li B, Qiu P, Zhang Q, Zhu L, Jin S, Yang X, Min L, Li G, Chen LL, Zheng H, Lindsey K, Lin Z, Udall JA, Zhang X. 2019. Reference genome sequences of two cultivated allotetraploid cottons, *Gossypium hirsutum* and *Gossypium barbadense*. Nature Genetics 51(2):224–229 DOI 10.1038/s41588-018-0282-x.
- Waters MT, Wang P, Korkaric M, Capper RG, Saunders NJ, Langdale JA. 2009. GLK transcription factors coordinate expression of the photosynthetic apparatus in *Arabidopsis*. *Plant Cell* **21**(4):1109–1128 DOI 10.1105/tpc.108.065250.
- Wray GA, Hahn MW, Abouheif E, Balhoff JP, Pizer M, Rockman MV, Romano LA. 2003. The evolution of transcriptional regulation in eukaryotes. *Molecular Biology and Evolution* 20(9):1377–1419 DOI 10.1093/molbev/msg140.
- Xiao Y, You S, Kong W, Tang Q, Bai W, Cai Y, Zheng H, Wang C, Jiang L, Wang C, Zhao Z, Wan J. 2019. A GARP transcription factor anther dehiscence defected 1 (OsADD1) regulates rice anther dehiscence. *Plant Molecular Biology* 101(4–5):403–414 DOI 10.1007/s11103-019-00911-0.
- Yasumura Y, Moylan EC, Langdale JA. 2005. A conserved transcription factor mediates nuclear control of organelle biogenesis in anciently diverged land plants. *Plant Cell* 17(7):1894–1907 DOI 10.1105/tpc.105.033191.
- Yu CS, Chen YC, Lu CH, Hwang JK. 2006. Prediction of protein subcellular localization. *Proteins* 64(3):643–651 DOI 10.1002/prot.21018.
- Zhang B, Liu J, Yang ZE, Chen EY, Zhang CJ, Zhang XY, Li FG. 2018. Genome-wide analysis of *GRAS* transcription factor gene family in *Gossypium hirsutum* L. *BMC Genomics* 19(1):348 DOI 10.1186/s12864-018-4722-x.