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**INVITED SPECIAL ARTICLE** For the Special Issue: Plant–Environment Interactions: Integrating Across Levels and Scales

# Genetic and physiological mechanisms of freezing tolerance in locally adapted populations of a winter annual

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**PREMISE**: Despite myriad examples of local adaptation, the phenotypes and genetic variants underlying such adaptive differentiation are seldom known. Recent work on freezing tolerance and local adaptation in ecotypes of *Arabidopsis thaliana* from Italy and Sweden provides an essential foundation for uncovering the genotype–phenotype–fitness map for an adaptive response to a key environmental stress.

**METHODS**: We examined the consequences of a naturally occurring loss-of-function (LOF) mutation in an Italian allele of the gene that encodes the transcription factor *CBF2*, which underlies a major freezing-tolerance locus. We used four lines with a Swedish genetic background, each containing a LOF *CBF2* allele. Two lines had introgression segments containing the Italian *CBF2* allele, and two contained deletions created using CRISPR-Cas9. We used a growth chamber experiment to quantify freezing tolerance and gene expression before and after cold acclimation.

**RESULTS:** Freezing tolerance was lower in the Italian (11%) compared to the Swedish (72%) ecotype, and all four experimental *CBF2* LOF lines had reduced freezing tolerance compared to the Swedish ecotype. Differential expression analyses identified 10 genes for which all *CBF2* LOF lines, and the IT ecotype had similar patterns of reduced cold responsive expression compared to the SW ecotype.

**CONCLUSIONS**: We identified 10 genes that are at least partially regulated by *CBF2* that may contribute to the differences in cold-acclimated freezing tolerance between the Italian and Swedish ecotypes. These results provide novel insight into the molecular and physiological mechanisms connecting a naturally occurring sequence polymorphism to an adaptive response to freezing conditions.

**KEY WORDS** adaptive phenotypic plasticity; *Arabidopsis*; *CBF2*; CRISPR-Cas9; cold acclimation; freezing tolerance; genotype–phenotype mapping; local adaptation; RNAseq; winter annual.

Adaptation to local environments, particularly those where stress imposes strong selection, should involve phenotypic differentiation for ecologically important traits. Such locally adaptive traits are unlikely to be beneficial in contrasting environments (Clausen et al., 1940). More generally, fitness trade-offs across environments are thought to drive biological diversification at multiple scales (MacArthur, 1972; Futuyma and Moreno, 1988; Whitlock, 1996; Hereford, 2009). Despite many dozens of empirical studies

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of local adaptation (reviewed by Hereford, 2009) and a growing number of examples mapping the genetic basis of fitness in ancestral environments (Lowry et al., 2009; Hall et al., 2010; Ågren et al., 2013, 2017; Anderson et al., 2013; Leinonen et al., 2013; Postma and Ågren, 2016), there are still very few cases where the traits underlying local adaptation have been identified and experimentally confirmed. Rarer still are examples of the molecular and physiological mechanisms of local adaptation (Anderson et al., 2011; Savolainen et al., 2013; Tiffin and Ross-Ibarra, 2014; VanWallendael et al., 2019).

Identifying the genes that underlie local adaptation may provide critical data to bear, for example, on a longstanding debate about the importance of moderate- to large-effect alleles in adaptation (Fisher, 1930; Kimura, 1983; Orr, 1998, 2005; Rockman, 2012; Lee et al., 2014; Rausher and Delph, 2015; Remington, 2015; Dittmar et al., 2016). While quantitative trait loci (QTL) detected in crosses between populations and species suggest that large effect alleles may commonly contribute to variation in ecologically important traits (Rausher and Delph, 2015; Remington, 2015), identifying the causal genes is important for ruling out the possibility these QTL actually represent many linked genes of small effect (c.f., Rockman, 2012).

Approximately two thirds of the land on earth experiences freezing temperatures at least occasionally during a given year (Larcher, 1980); therefore, freezing tolerance is one trait that is likely to have broad adaptive significance for many plant species. Freezing tolerance typically requires a period of cold acclimation, an extended period of cold, but nonfreezing temperatures (Thomashow, 1999, 2010; Preston and Sandve, 2013; Barrero-Gil and Salinas, 2018), which induces major changes in gene expression, metabolism, and physiology. Typical changes during acclimation include increased production of soluble sugars and other compounds that decrease the freezing point of the cell as well as proteins and metabolites to stabilize membranes, reduce or resist ice re-crystallization in extracellular spaces, and resist desiccation (Thomashow, 1999, 2010; Preston and Sandve, 2013; Barrero-Gil and Salinas, 2018; Zuther et al., 2018). Thus, cold-acclimated freezing tolerance is an example of adaptive phenotypic plasticity, in which cold temperatures trigger an inducible physiological mechanism to increase survival through subsequent freezing periods.

Connecting the causal chain between sequence polymorphism, molecular phenotypes, organismal phenotypes, and ultimately fitness in contrasting environments is not an easy task. It is well beyond the scope of any individual study to provide all the necessary information. One clear path toward linking sequence polymorphism to ecologically relevant traits, and ultimately to fitness, is to conduct detailed studies of the molecular and physiological mechanisms of adaptive traits in study systems for which local adaptation has already been demonstrated (Tonsor et al., 2005). Indeed, in their recent review on stress response networks in plant local adaptation, VanWallendael et al. (2019) highlight that "integrating field-based studies of local adaptation with mechanistic physiological and molecular biology promises advances in multiple areas of plant science."

Differences in freezing tolerance between locally adapted (Ågren and Schemske, 2012; Ågren et al., 2013; Oakley et al., 2014) ecotypes of *Arabidopsis thaliana* (hereafter *Arabidopsis*) from Sweden (SW) and Italy (IT) represent one such opportunity to uncover the genetic and physiological mechanisms of plant interactions with a stressful environment in the context of local

adaptation. In over 8 years of field experiments, QTL for local adaptation in a cross between SW and IT have been mapped (Ågren et al., 2013; Postma and Ågren, 2016; C. G. Oakley and J. Ågren, unpublished data). In field and laboratory studies, our group has identified freezing as a major selective agent in SW (Ågren and Schemske, 2012; Ågren et al., 2013; Oakley et al., 2014) and found large-effect freezing tolerance QTL in the same genomic regions as the QTL for local adaptation and fitness trade-offs (Oakley et al., 2014).

The causal variant underlying the largest-effect freezingtolerance locus between the SW and IT ecotypes has been identified as a loss-of-function mutation in the IT allele of the gene encoding the transcription factor CBF2 (Gehan et al., 2015). The causal nature of CBF2 for this locus has been functionally validated using electrolyte-leakage assays for freezing tolerance in both transgenic and CRISPR mutant lines (Gehan et al., 2015; Park et al., 2018). CBF2 is well known to be a major regulator of freezing tolerance in both the common Col-0 ecotype and in other natural accessions of Arabidopsis (Thomashow, 1999, 2010; Alonso-Blanco et al., 2005; Park et al., 2015; Barrero-Gil and Salinas, 2018). The CBF genes generally, and CBF2 in particular, have been shown to mediate large scale changes in gene expression in response to even short-term cold acclimation (Hannah et al., 2006; Gehan et al., 2015; Park et al., 2015, 2018; Jia et al., 2016; Zhao et al., 2016; Shi et al., 2017).

Recent studies have primarily focused on the effects of lossof-function mutations of all three CBF genes on freezing tolerance and global gene expression and typically identify over a hundred genes with differential expression after cold acclimation (Park et al., 2015, 2018; Jia et al., 2016; Zhao et al., 2016). Here we are specifically interested in the effects of CBF2 on differential cold-acclimated gene expression and survival through freezing between the IT and SW ecotypes because of direct implications of loss of function of CBF2 for local adaptation. We hypothesized that CBF2 is a key regulator of adaptive phenotypic plasticity in the SW ecotype of Arabidopsis. By identifying the target genes specifically regulated by CBF2 during cold acclimation and examining what is known about the function of those genes, we aimed to gain a greater understanding of the genetic and physiological mechanisms through which CBF2 mediates freezing tolerance in the SW ecotype.

In this study, we used a growth chamber freezing assay and RNAseq to investigate the role of CBF2 in differential coldacclimated freezing tolerance between the SW and IT ecotypes. We quantified freezing tolerance as survival through freezing and also quantified differential gene expression before and after cold acclimation using two independent CBF2 loss-of-function mutant lines (produced using CRISPR-Cas9) in the SW genetic background, as well as two near-isogenic lines (NILs) where we have introgressed a small part of the IT genome including the nonfunctional CBF2 allele into the SW genetic background. We asked the following questions: (1) What proportion of the difference in freezing tolerance between the SW and IT ecotypes can be explained by a CBF2 loss-of-function mutation? (2) Which of the genes that exhibit differences in cold-responsive expression between SW and IT are downstream targets of CBF2? (3) For these genes, how much of the differential cold-acclimated expression between SW and IT is regulated by CBF2, and what is known about their molecular and physiological roles in freezing tolerance?

# MATERIALS AND METHODS

#### Study system

Arabidopsis thaliana is a small selfing (Abbott and Gomes, 1989) annual with a wide native range in Europe, Asia, and Africa (Koornneef et al., 2004; Beck et al., 2008; Durvasula et al., 2017), where many populations exhibit a winter annual life history (Montesinos et al., 2009; Ågren and Schemske, 2012; Burghardt et al., 2016). At the IT site (Castelnuovo; 42°07'N, 12°29'E), seeds germinate in October and November, and plants experience cold but nonfreezing temperatures throughout the winter as rosettes (Ågren and Schemske, 2012). At the SW site (Rödåsen; 62°48'N, 18°12'E), seeds germinate in August and September, and seedlings experience low temperatures in the autumn before overwintering as rosettes (Ågren and Schemske, 2012). Both populations experience temperatures that trigger cold acclimation. The range of conditions over which cold acclimation is induced is poorly known and is likely to vary across taxa, but 4°C has been shown to induce cold acclimation in Arabidopsis thaliana (Alonso-Blanco et al., 2005; Hannah et al., 2006; Zhen and Ungerer, 2008) and winter wheat (Zhu et al., 2014; Skinner, 2015). In winter at the SW site, soil temperatures are usually below freezing for more than 80 days, and temperatures can reach as low as -11°C, with air temperatures even colder (Oakley et al., 2014). Relative survival of the IT ecotype in Sweden has been shown to be positively correlated with winter minimum soil temperature across years (Ågren and Schemske, 2012), indicating strong temporal variation in the strength of selection imposed by freezing.

## **CRISPR and NIL construction**

To mimic the loss-of-function mutation in CBF2 found in IT, we utilized the CRISPR/Cas9 system to generate two independent CBF2 loss-of-function mutant lines in the SW genetic background. We followed a multigenerational approach to create the CRISPR lines (Feng et al., 2014). Briefly, the 19-bp oligonucleotides designed to target the coding region of CBF2 under control of the AtU6 promoter were cloned to a single binary vector (pCambia1300): CBF2, 5'-TCGCCGCCATAGCTCTCCG-3'. Seeds generated after a floral dip were exposed to an antibiotic medium to select the first generation of transformed seeds (T1), which were sequenced to confirm the CBF2 mutation. Transgenic plants with the CBF2 mutation were self-pollinated for two generations to obtain T3 lines homozygous for the CBF2 loss-of-function mutations. The T3 lines were then backcrossed to SW to remove any possible insertional effects by the T-DNA containing the CRISPR/Cas9 transgene. Two lines were produced (Appendix S1): SW:cbf2 a, which is the same line with a 19-bp deletion in the coding region of CBF2 of Park et al. (2018), and SW:cbf2 b, with a 13-bp deletion in the coding region of CBF2.

We also produced two independent NILs for the *CBF2* region by crossing recombinant inbred lines with IT introgression segments including *CBF2* to the SW ecotype. The backcrossed lines were then selfed for several generations, and lines of interest were genotyped using a combination of 2b-RAD (Wang et al., 2012) and PCR-based genotyping strategies. Two NILs were ultimately generated and used in this experiment, both with introgression segments that include *CBF2*: NIL R37, which has a 2.4-Mb segment, and NIL R38, which has a 6.8-Mb segment. Our use of both CRISPR lines and NILs in this experiment was motivated by a desire to link these results with

field-based estimates of survival and reproduction for plants with functional and nonfunctional *CBF2* alleles. The inclusion of NILs in addition to the CRISPR lines here allows us to compare the effects of the native IT loss-of-function allele with those of experimental mutations. Having replicate lines of both types dramatically increases our confidence that the effects we observe in the CRISPR mutants are due to the loss of function of *CBF2* and not to off-target genes.

# **Freezing assay**

To quantify the effect of the loss-of-function mutation in *CBF2* on freezing tolerance, we exposed seedlings from six different lines (IT, SW, the two SW background NILs, and two SW background CRISPRs *CBF2* loss-of-function lines) to a freezing assay in which seedlings in a growth chamber were subjected to a period of cold acclimation followed by freezing. The experiment was randomized in a stratified fashion in a complete block design. Each block consisted of two quartered petri dishes (i.e., eight cells total), and 12 individual seeds of each line were sown in one cell. There were 60 blocks in total, divided evenly among 10 trays to facilitate randomization within the growth chamber. This entire experimental design was repeated three times, with each temporally separated growth chamber experiment referred to as a batch.

The freezing assay protocol follows that of Oakley et al. (2014). The temperature and photoperiod conditions were loosely based on site-level soil and air temperature data from the SW site and day length data from the U.S. Naval Observatory (Ågren and Schemske, 2012; Oakley et al., 2014). Briefly, seeds were sterilized using a 30% v/v bleach and 0.04% v/v Tween 20 solution for 10 min and suspended in 0.1% w/v Phytoblend agar (Caisson Laboratories, Smithfield, UT, USA) overnight in the dark at 4°C before sowing. All seeds were sown on autoclaved Gamborg's B-5 basal salts (without sucrose) and Phytoblend agar and poured into sterilized petri dishes. The petri dishes were cold-stratified in the dark at 4°C for 5 days to synchronize germination. This cold-stratification period alone is insufficient to induce significant freezing tolerance (C. G. Oakley, unpublished data). This was followed by germination and early growth for 8 days in a growth chamber at 22°C, 16-h day (16L:8D) with a photosynthetically active radiation (PAR) of 125 µmol photons m<sup>-2</sup> s<sup>-1</sup>. After this period, we put lids on the trays to reduce drying of the agar medium and moved the trays to a chamber capable of freezing temperatures to initiate 10 days of cold acclimation (4°C, 10L:14D, 50 PAR). We next reduced the temperature to  $-2^{\circ}$ C for 24 h and added shaved ice to each cell to facilitate ice nucleation (Smallwood and Bowles, 2002).

For the freezing period, plants were exposed to  $-7^{\circ}$ C for 8 days, which represents a minimum soil temperature that plants might experience in a cold year in Sweden; previous work has shown that freezing at this temperature results in realistic (based on field survival, see below) and repeatable differences between the two ecotypes (Oakley et al., 2014). The duration of the freezing period was chosen based on practical constraints (Oakley et al., 2014). During this freezing period, the petri dishes were kept in the dark, as done previously (Alonso-Blanco et al., 2005; Zhen and Ungerer, 2008; Kang et al., 2013; Oakley et al., 2014). Plants at the SW site are often covered in snow during freezing temperatures, which should minimize the exposure to light and thus photoperiod. To mitigate temperature variation within the chamber, we used supplemental fans and rotated trays twice a day.

After the freezing period, we brought the chamber up to 4°C for 24 h to gradually thaw the plants, followed by 48 h at 22°C before scoring. Although this protocol does not replicate natural conditions due to practical constraints, the relative survival of the IT and SW ecotypes after exposure to this protocol closely resembles overwinter survival at the SW site in cold years (Ågren and Schemske, 2012; Oakley et al., 2014), suggesting that we capture the essential elements of field conditions relevant to freezing tolerance.

We quantified freezing tolerance per cell as mean percentage survival after the freezing period. Some cells were not included in the freezing tolerance assay because the plants were sacrificed to collect RNA samples (see below). We excluded seedlings that did not develop true leaves, as preliminary results indicated that seedlings of this size are not freezing tolerant regardless of genotype. Plants included in the analysis typically had at least four true leaves and were assayed at a small size because freezing occurs early in the life history at the SW site (Oakley et al., 2014). Preliminary experiments with larger plants resulted in similar differences in freezing tolerance between the two ecotypes (D. W. Schemske, unpublished data). Of the total 942 cells included in the freezing assay, we excluded 97 cells because they contained fewer than four individual plants of sufficient size to collect freezing-tolerance data. In the final data set, freezing tolerance was estimated for an average of 140.8 cells per line (range = 122–158), each containing an average of 8.26 individual plants for a grand total of 7005 individuals.

Freezing tolerance was analyzed with an analysis of variance with line as a fixed effect. Because of the limited number of batches (3), this factor was treated as a fixed effect. Block nested within batch was treated as a random effect, and significance was tested with a likelihood ratio test. We were primarily interested in the reduction in freezing tolerance resulting from a nonfunctional *CBF2* allele; therefore, we limited pairwise comparisons to those involving the SW ecotype and tested these with a priori linear contrasts. With the exception of IT, which had about a 5-fold greater number of zero values for cell mean freezing tolerance compared with the other lines (Appendix S2), the residuals of this model were approximately normally distributed with minimal heteroscedasticity. Reanalysis of a model excluding IT yielded qualitatively similar results for the overall effect of line and the pairwise contrasts to SW (not shown), so we proceeded with the full model. All statistics were performed in JMP v. 13 (JMP, 1989–2019).

#### **RNA extraction**

We randomly selected six blocks in the first batch to be completely harvested for RNA sequencing, and these blocks were excluded from the freezing-tolerance assay. We harvested all available plant tissue (roots and leaves), 4 h after the lights came on to minimize the effects of circadian rhythm (Dong et al., 2011). We used the RNeasy Plant Mini Kit (Qiagen, Hilden, Germany) for RNA extraction using three replicates of each line at both pre-acclimation (22°C) and post-acclimation (4°C for 10 days) conditions. Total RNA was quantified and checked for quality using a Qubit Fluorometer (Life Technologies Holdings, Singapore) and a 2100 Bioanalyzer (Agilent Technologies, Santa Clara, CA, USA) at the RTSF Genomics Core at Michigan State University.

# Sequencing

Samples were prepared using the Illumina TruSeq Stranded mRNA Library preparation kit (Illumina, San Diego, CA, USA)

on a Perkin Elmer Sciclone NGS (Perkin Elmer, Waltham MA, USA). Completed libraries were quality checked and quantified using a combination of Qubit dsDNA HS and Caliper LabChipGX HS DNA (Perkin Elmer) assays. Libraries were pooled for multiplexed sequencing. Sequencing was carried out in a  $1 \times 50$ -bp single-end format using Illumina HiSeq 4000 SBS reagents. Base calling was done by Illumina Real Time Analysis (RTA) v2.7.6, and output of RTA was demultiplexed and converted to FastQ format with Illumina Bcl2fastq v2.18.0.

#### **RNA-sequencing analyses**

**Quality control and mapping**—Remaining adapter sequences were removed, bases with quality scores less than 5 were trimmed, and reads smaller than 33 bp were excluded using cutadapt v. 1.8.1 (Martin, 2011). Quality of the remaining reads was inspected using FastQC (Andrews, 2010). RNA-sequencing (RNA-seq) reads from the different genotypes were mapped to the *Arabidopsis thaliana* reference genome (TAIR10) using TopHat v. 2.1.0 (Kim et al., 2013). TopHat was run in default mode with the following exceptions: the minimum intron length was set to 10 and maximum to 15,000 bp. A GTF file (TAIR10) was used to assist in the mapping of known junctions. Read counts for each gene were obtained using HTSeq 0.6.1 (EMBL, Heidelberg, Germany) using the intersection-noempty option to only include counts for reads mapping to one unique gene.

**Differential gene expression**—Differential expression analysis was implemented in R version 3.0.1 (R Core Team, 2011) with the edgeR package v. 3.22.3 (Robinson et al., 2010). Because estimates of differential gene expression can be inflated by weakly expressed genes, we included only genes with more than one read per million (>1 CPM) in at least two samples. We used the trimmed mean of M-values (TMM) as our normalization method (Robinson et al., 2010).

Ultimately, we were interested in differential gene expression as an interaction between CBF2 alleles and the cold-acclimation treatment (pre- vs. post-cold acclimation), and the extent to which loss-of-function mutations in CBF2 can explain differential expression between IT and SW in response to cold acclimation. The one thing in common among the IT ecotype and the four total NIL and CRISPR lines (in a SW background) is a nonfunctional CBF2 allele. We therefore used five separate generalized linear models to test for an interaction between genotype and the cold-acclimation treatment on gene expression. SW was included in all five comparisons (see Appendix S3: Eqs. 1-5 for the log, fold-change calculations that correspond to the hypotheses tested in these models). We first identified the genes with differential cold-responsive expression between IT and SW, because it is only this set of genes that can explain differential freezing-tolerance between these ecotypes (Appendix S3: Eq. 1). For this set, we consider only genes for which there was a significant (at a Benjamini-Hochberg FDR corrected *P* value [hereafter  $P_{FDR}$ ]  $\leq$  0.05) interaction between genotype and cold acclimation treatment in the SW vs. IT comparison.

We then narrowed the set of genes that were differentially cold responsive between SW and IT (above) to identify only those genes that are regulated by *CBF2* in response to cold acclimation. Each of the SW vs. NIL/CRISPR line comparisons is a measure of the effect of a loss-of-function mutation in *CBF2* on coldresponsive gene expression (Appendix S3: Eqs. 2–5). Because we have multiple independent comparisons, which is in and of itself an approach to reducing false positives, we took a modified approach to adjusting *P* values for multiple comparisons to minimize false negatives. We therefore considered genes as potential targets of *CBF2* if they were identified as significant in the comparison between SW and IT (above) and also had a significant genotype × treatment interaction in all four of the pairwise comparisons of SW vs. NIL/CRISPR lines at an uncorrected *P* value < 0.05. These independent comparisons comprise stringent criteria for eliminating false positives without resorting to  $\log_2$  fold-change thresholds commonly employed in studies of differential gene expression, allowing us to potentially identify target genes of *CBF2* with subtle cold responsiveness.

To assess the extent to which *CBF2* is responsible for differential cold responsiveness between SW and IT of each of these genes, we used the values for the  $\log_2$  fold-change (LFC) of the pairwise contrasts from edgeR for each of the genes that met both of the significance criteria (see above). Using the difference in cold responsive gene expression between SW and IT as a frame of reference (Appendix S3: Eq. 1), we calculated the average proportion of the differential cold responsiveness between SW and IT (among Appendix S3: Eqs. 2–5) explained by the four *CBF2* loss-of-function lines. For a given target gene, this value represents the contribution of *CBF2* in regulating differential cold-responsive expression between the SW and IT ecotypes. This approach to using the difference between two ecotypes as the frame of reference, rather than simply the background genotype, is novel and allows us to more directly relate these patterns to local adaptation.

We used RT-qPCR to confirm the results of our RNAseq experiment for two genes that exhibited significant genotype × cold acclimation treatment interactions. RNA was extracted as described above, and RT-qPCR was performed using the Luna Universal Onestep RT-qPCR kit (New England Biolabs, Ipswich, MA, USA) on a Bio-Rad CFX Connect Real-Time PCR Detection System (Bio-Rad Laboratories, Hercules, CA, USA). The threshold quantification cycle (Cq) was determined using Bio-Rad CFX Manager version 3.1. Relative expression ratios were quantified based on the corresponding efficiency of the primers for each gene and the deviation of Cq values for each sample from the mean Cq values of the pre-acclimation samples for each gene (Pfaffl, 2001), in relation to the housekeeping gene ACT2.

**Gene ontology**—To assess the function of genes that exhibited significant genotype by environment interactions in the SW vs. IT comparison, we performed a gene ontology (GO) enrichment analysis using the PANTHER v. 14 overrepresentation test, performed with the GO biological processes complete annotations for the complete *Arabidopsis thaliana* gene database (Mi et al., 2019). Fisher

exact tests were used to estimate the GO term enrichment *P* values, and a false discovery rate adjustment of *P* values was calculated to correct for the large number of comparisons.

# RESULTS

#### **Freezing assay**

Overall freezing tolerance for the 845 cells (see Materials and Methods) was 50.2% (SD = 34.5%), and ranged from 0% to 100% (Appendix S4). Genotype had a highly significant effect on freezing tolerance ( $F_{5.689} = 109.5$ , P < 0.001). This strong signal of genetically based differences in freezing tolerance was apparent even with significant variation among batches ( $F_{2,156} = 32.5, P < 0.001$ ), and among blocks nested within batch ( $\chi^2 = 124.8, df = 1, P < 0.001$ ). Least square mean freezing tolerance for IT was 11.4%, which was significantly lower than that of SW of 71.9% (Table 1, Fig. 1). These differences in freezing tolerance between IT and SW are similar to differences in overwinter survival at the SW site in cold years (Ågren and Schemske, 2012; Oakley et al., 2014), so differences reported here are reflective of differences in a key fitness component in nature. All four lines with a nonfunctional CBF2 in the SW genetic background had significantly and substantially reduced freezing tolerance compared to SW (Table 1, Fig. 1). Absolute reductions in mean freezing tolerance compared to SW for these four lines ranged from 13.1% to 25.7%, explaining roughly 1/5 to 2/5 of the difference between SW and IT in mean freezing tolerance (Table 1, Fig. 1). Much of the variation among these four lines is attributable to the somewhat higher freezing tolerance of NIL R37 compared to the other 3 lines (Table 1, Fig. 1).

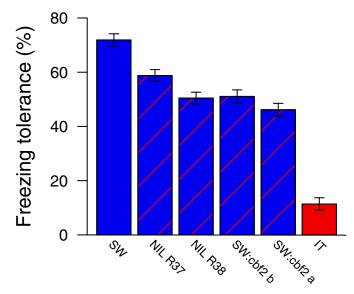
#### **Gene expression**

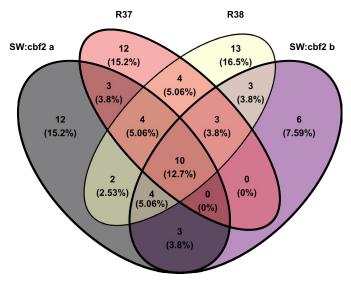
**Differences between SW and IT**—There were 249 genes that were differentially cold responsive between SW and IT (genotype by treatment interaction) at  $P_{\rm FDR} \leq 0.05$  (Appendices S5, S6). These genes are involved in genetic pathways including response to stress (54/3157 annotated GO terms,  $P_{\rm FDR} < 0.001$ ), response to abiotic stimulus (38/2099,  $P_{\rm FDR} = 0.033$ ), and response to water deprivation (14/346,  $P_{\rm FDR} = 0.007$ ), among others (Appendix S7).

**Potential role of targets of CBF2 in mediating cold acclimation**—The 249 genes described above likely include a set of genes directly involved in differential freezing tolerance between SW and IT. To isolate only the genes that are differentially regulated by *CBF2* in response to cold acclimation, we examined patterns of

**TABLE 1.** Least square mean freezing tolerance (FrzTol) for each of the six lines in the study. Also given is the reduction in FrzTol of each line compared to SW and the results of the linear contrast from the ANOVA test of the significance of these differences. The final column gives the reduction in freezing tolerance for each *CBF2* loss-of-function line expressed as a proportion of the difference in freezing tolerance between SW and IT.

Line	FrzTol (%)	Reduction compared to SW	Linear contrast compared to SW	Proportion of difference between SW and IT explained
SW	71.9	n/a	n/a	n/a
NIL R37	58.8	13.1	$F_{1,688} = 24.8, P < 0.001$	0.22
NIL R38	50.4	21.5	$F_{1.687} = 66.5, P < 0.001$	0.36
SW:cbf2 b	51.1	20.8	$F_{1.696} = 54.1, P < 0.001$	0.34
SW:cbf2 a	46.2	25.7	$F_{1.695} = 85.7, P < 0.001$	0.43
IT	11.4	60.5	$F_{1,690} = 490.5, P < 0.001$	n/a





**FIGURE 1.** Mean freezing tolerance of the SW and IT ecotypes and the two NILs and two CRISPR mutant lines containing CBF2 loss-of-function alleles in the SW background. Error bars are 1 SE. Linear contrasts comparing SW to each of the other lines were all highly significant (Table 1).

cold-responsive gene expression in the CBF2 loss-of-function lines. For all six lines, expression of CBF2 before cold acclimation was very low (<0.3 CPM) and was very high after cold acclimation (range = 17-33 CPM). For the pairwise comparisons of SW to NILs, 36 genes for NIL R37 and 43 for NIL R38 differed significantly in coldresponsive expression between SW and IT ( $P_{\text{FDR}} \leq 0.05$ ) and further had a significant genotype × cold acclimation treatment interaction at an uncorrected *P* < 0.05 (Fig. 2; Appendices S8, S9). There were 21 genes meeting both criteria in common between both NILs. For the pairwise comparisons of SW to CRISPR lines, there were 38 genes for SW:cbf2 a and 29 for SW:cbf2 b met both criteria described above (Fig. 2; Appendices S10, S11). There were 17 genes meeting both criteria in common between both CRISPR lines. There were only 10 cold-responsive genes meeting both criteria in common among the four NILs and CRISPR lines (Fig. 2; Appendix S12). The 10 genes had annotations with significantly enriched gene ontology terms such as response to abiotic stimulus (GO:0009628), response to stress (GO:0006950), and response to water (GO:0009415).

We further categorized these 10 genes based on the magnitude of differential expression between pre- and post-cold acclimation treatments in SW and the average percentage of the difference between IT and SW that is attributable to CBF2 (Table 2). In other words, we categorized genes first based on how cold responsive they were in SW, then we quantified how much of the difference in cold responsiveness between SW and IT can be explained on average by loss-of-function mutations in CBF2 (see Appendix S3 for a full description of these calculations). The first category of genes comprises those that are very highly cold responsive (in terms of the log, fold-change in response to cold) in SW, GolS3 (LFC<sub>caSW</sub> = 6.36) and AT4G30830 (LFC<sub>caSW</sub> = 4.15; Table 2, Fig. 3; Appendix S12). GolS3 exhibited a striking pattern of cold acclimated gene expression where all four lines with loss-of-function mutations in CBF2 had nearly identical patterns of expression to IT (explaining on average 86% of the difference between SW and IT), suggesting that CBF2 almost completely mediates the difference between SW and IT in

**FIGURE 2.** Venn diagram of the 79 genes that differ in cold-responsive gene expression between SW and IT (of the 249 genes with a significant genotype by treatment interaction,  $P_{FDR} \le 0.05$ ) that also differ for at least one pairwise comparison of the NILs and CRISPR lines to SW (genotype × treatment interaction, P < 0.05). The plot was generated using the venn. diagram function in the R package Venn Diagram (Chen, 2018).

cold-acclimated gene expression of *GolS3*. The relative expression patterns that we observed using RT-qPCR for GolS3 were consistent with the results we obtained using RNAseq (Appendix S13). For AT4G30830, *CBF2* could explain on average 44% of the log-fold difference between SW and IT.

The second category represents highly cold-responsive genes (LFC<sub>caSW</sub> between 1.91 and 2.70) in SW and included six genes *LEA14*, *CCT2*, *COR-413PM1*, *ERD10*, *COR47*, and *ERD7* (Table 2, Fig 4; Appendix S12). Among these, *CBF2* explained the greatest difference in log<sub>2</sub>-fold cold-responsive gene expression between SW and IT for *LEA14* (81%) and *CCT2* (69%), with lower values for *COR-413PM1* (53%), *ERD10* (49%), and even lower values for *COR47* (35%) and *ERD7* (34%). Some of these genes are therefore predominantly regulated by *CBF2*, whereas for others, *CBF2* plays an important, but not predominant role in regulation. The relative expression patterns that we observed using RT-qPCR for *COR413-PM1* were consistent with the results we obtained using RNAseq (Appendix S13).

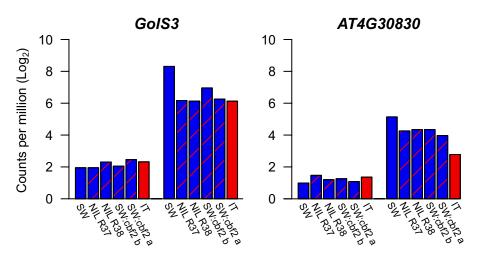
The final category of genes comprises those that are modestly (AT3G55760, LFC<sub>caSW</sub> = 1.18) or weakly (*DEAR3*, LFC<sub>caSW</sub> = 0.43) cold responsive in SW (Table 2; Appendices S12, S14). Despite the limited cold responsiveness of these genes in SW, *CBF2* could explain a large proportion of differential log<sub>2</sub>-fold cold responsiveness between SW and IT, 65% for AT3G55760 and 84% for *DEAR3*.

# DISCUSSION

Freezing tolerance is likely to be a key adaptation to stressful environments for many plants, and because freezing tolerance requires cold acclimation, it likely represents adaptive phenotypic plasticity. We found that a single mutation in *CBF2* drives major differences between the SW and IT ecotypes in adaptive phenotypic plasticity in the form of cold acclimation, explaining one third of the differential freezing tolerance between the SW and IT ecotypes.

Alias	Gene	Difference in cold responsiveness between SW and IT (log <sub>2</sub> fold-change)	Average reduction in cold responsiveness due to <i>CBF2</i> LOF (log <sub>2</sub> fold-change)	Difference between SW and IT explained by CBF2 (%)
GolS3	AT1G09350	2.53	2.16	86
n/a	AT4G30830	2.71	1.18	44
LEA14	AT1G01470	0.91	0.75	81
CCT2	AT4G15130	0.85	0.59	69
COR413-PM1	AT2G15970	0.98	0.52	53
ERD10	AT1G20450	1.53	0.75	49
COR47	AT1G20440	1.79	0.63	35
ERD7	AT2G17840	1.51	0.51	34
n/a	AT3G55760	1.53	0.99	65
DEAR3	AT2G23340	0.86	0.73	84

**TABLE 2.** Differences in cold-responsive gene expression between SW and IT and the average effect of *CBF2* loss-of-function (LOF) mutations on cold-responsive expression for the 10 candidate genes. Differences in cold responsiveness between SW and IT were calculated using Eq. 1 in Appendix S3. Average reductions in cold responsiveness due to *CBF2* LOF were calculated as the average using Eqs. 2–5 in Appendix S3.



**FIGURE 3.** Log<sub>2</sub> counts per million for the most highly cold-responsive genes of the 10 candidates before (left group of bars) and after (right group of bars) cold acclimation.

Our approach using four independent genetic lines with loss-offunction mutations in *CBF2* and explicitly testing for genotype  $\times$ treatment interactions for gene expression identified a remarkably short list of 10 candidate target genes that may play an important role in cold-acclimated freezing tolerance mediated by *CBF2*.

#### Loss of function of CBF2 has a large effect on freezing tolerance

The reduction in freezing tolerance of the NILs and CRISPR lines relative to SW provides direct evidence that the naturally occurring loss-of-function mutation in the IT allele of CBF2 drives approximately one third of the differential survival through freezing between SW and IT. The absolute effect size observed here is somewhat lower than a previous estimate for a QTL containing CBF2 (Oakley et al., 2014), but the proportional difference between SW and IT explained by CBF2 is similar to the QTL-based estimate (Oakley et al., 2014). The difference in freezing tolerance between the NILs (59% in NIL R37 compared to 50% in NIL R38) is difficult to explain, but the overall reduction in freezing tolerance for both lines follows the expected direction given the loss of function of CBF2. Regardless, these results suggest that local adaptation between SW and IT is in part driven by a large-effect allele of CBF2 in IT. Broad surveys of natural variation in CBF2 haplotypes in Arabidopsis have found that presumably functional variation in

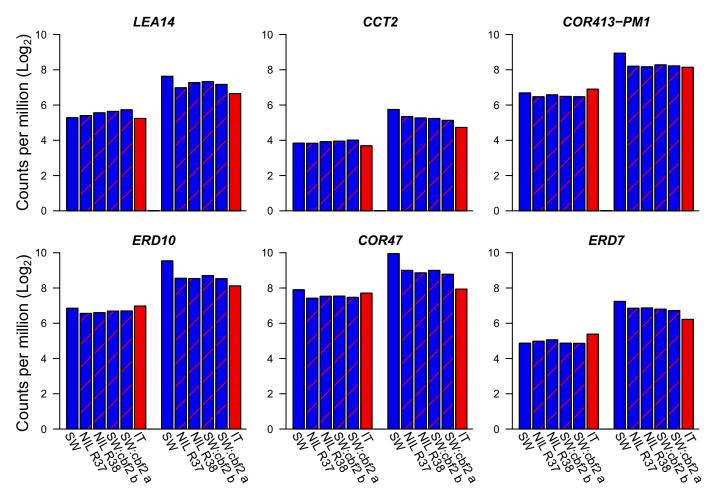
*CBF2* only occurs in warmer climates (Zhen and Ungerer, 2008; Monroe et al., 2016). This suggests that *CBF2* is likely important for regulating cold-acclimated freezing tolerance across the northern portion of the species' range and that *CBF2* polymorphisms beyond that observed between SW and IT may contribute to regional climatic adaptation.

Large-effect mutations have been thought to be unlikely to contribute to adaptive evolution (Fisher, 1930; Rockman, 2012) because of assumed negative pleiotropic effects. Despite these expectations, our results add to a growing body of literature that suggest large-effect alleles contribute substantially to variation in physiological and life history traits (Stinchcombe et al., 2004; Chiang et al., 2012; Xie et al., 2015). The IT allele

of *CBF2* has a deletion that results in a loss of function, and similar loss-of-function mutations in genes that encode proteins involved in DNA or protein interactions have been found to drive large differences in flowering time and germination (Stinchcombe et al., 2004; Chiang et al., 2012), trichome production (Bloomer et al., 2012), growth and reproductive timing (Brock et al., 2010), and circadian timing and cold and salt tolerance (Xie et al., 2015). Taken together, our results as well as those of previous studies suggest that loss-of-function mutations in regulatory genes can have important roles in driving differentiation among populations for ecologically important quantitative traits.

#### **Gene expression**

**Differences between SW and IT**—We identified 249 genes with a significant genotype (SW vs. IT) × cold acclimation treatment interaction. In a recent study, 5200 genes in the SW and IT ecotypes were identified as differentially expressed in response to cold (Fig. 1D; Gehan et al., 2015), though that study did not explicitly test for genotype × environment interactions. The genes identified in that study include 145 of the 249 genes we identified as differentially cold-responsive between the SW and IT ecotypes, including nine of our 10 candidate genes (Appendix S15). The 104 genes from our study that are not included in the Gehan et al. (2015) study include *DEAR3*, which exhibited slight



**FIGURE 4.** Log<sub>2</sub> counts per million for the remaining highly cold-responsive genes of the 10 candidates before (left group of bars) and after (right group of bars) cold acclimation.

but significant differences in cold-responsive expression in all pairwise comparisons (see below; Appendices S14, S16).

Potential targets of CBF2-mediated cold acclimation-There has been considerable recent interest in assessing the effects of lossof-function mutations in CBF on cold-acclimated gene expression and freezing tolerance (Jia et al., 2016; Zhao et al., 2016; Park et al., 2018). The focus of most of these studies is on the combined effects of loss of function in all three CBF genes to determine what is referred to as the "CBF regulon" for a given accession, rather than studying the effects of natural variation in individual CBF genes. Our work builds upon the recent study by Park et al. (2018), who used CRISPR-Cas9 to produce mutations in CBF genes in the SW genetic background. Here we used a CBF2 null mutant from Park et al. (2018), an additional independent CBF2 null mutant, and two NILs with IT loss-of-function mutations in a SW genetic background to hone in on the downstream targets of CBF2 that are in part responsible for differences in cold-acclimated freezing tolerance between IT and SW.

Examining the subset of genes that were differentially cold responsive between the SW and IT ecotypes that were also differentially cold responsive in all four lines with loss-of-function mutations in *CBF2* narrowed the list of candidates to just 10 genes. Because these genes were identified as significant in all of our

independent comparisons between SW and lines with nonfunctional *CBF2*, we have confidence that these are important candidate genes for downstream targets of *CBF2*. While not completely regulated by *CBF2*, these genes are likely responsible for most of the differences in freezing tolerance between SW and IT caused by the loss-of-function mutation in the IT *CBF2* allele and, thus, are also candidates for contributing to local adaptation between these ecotypes.

Two of the 10 candidates were very highly cold responsive in SW, galactinol synthase 3 and AT4G30830 (Fig. 3). Galactinol synthase 3 (GolS3) was the most cold responsive of the 10 candidate genes in SW (Table 2), and CBF2 could explain almost all of the differences in cold-acclimated GolS3 expression between SW and IT. GolS3 has been shown to be cold responsive in a number of studies (Maruyama et al., 2009; Park et al., 2015; Zhao et al., 2016), including those using the SW and IT ecotypes (Gehan et al., 2015; Park et al., 2018). This gene is also known to be induced by cold stress and plays a key role in biosynthesis of raffinose, an important osmoprotectant during cold and water stress (Taji et al., 2002). The other very highly cold-responsive gene in SW was AT4G30830, but the expression differences between SW and IT explained by CBF2 for this gene were more modest (~44%). AT4G30830, which is a myosin-like protein of unknown function (Krishnakumar et al., 2014) that has been described as cold responsive in other studies (Gehan et al., 2015; Park

et al., 2018). Future studies to identify what role AT4G30830 plays in cold-acclimated freezing tolerance would be worthwhile.

The next category of candidates included six genes that were all highly cold responsive in the SW ecotype (Fig. 4). Of these genes, ERD10, COR413-PM1, and CCT2 were previously identified as part of the CBF regulon in a few accessions (Appendix S17). The amount of the differential cold-responsive gene expression between SW and IT explained by CBF2 varied from 34-81% (Table 2), indicating variation in the extent to which these genes are regulated by CBF2. LEA14 encodes a late embryogenesis abundant protein, a class of proteins that is induced by cellular stress, particularly desiccation (Singh et al., 2005), and thought to contribute to biomolecule and membrane stability (Candat et al., 2014). CCT2 encodes a phosphorylcholine cytidylyltransferase, which acts to increase cellular phosphorylcholine content, an important component of biological membranes, in response to cold (Inatsugi et al., 2009). COR413-PM1 encodes a multispanning transmembrane protein localized to the plasma membrane that is correlated with freezing tolerance in Arabidopsis and cereal crops (Breton et al., 2003) and may play a role in maintaining membrane fluidity under cold temperatures (Su et al., 2018). ERD10 and COR47 encode dehydrin family proteins, thought to play an important role in cellular desiccation resistance, and both have been shown to increase freezing tolerance (Puhakainen et al., 2004). ERD7 is a drought inducible gene that has been shown to be cold responsive (Kimura et al., 2003).

The final two genes in our list of 10 candidates were those with only modest or low cold responsiveness in SW. In spite of their relatively small cold responsiveness on an absolute scale, much of the differences in expression between SW and IT for these genes could be attributed to *CBF2* (65% for *AT3G55760* and 84% for *DEAR3*). Neither of these genes have been previously described as part of the CBF regulon for SW (Park et al., 2018), but both have been identified as part of regulons from other genetic backgrounds (Appendix S17). AT3G55760 is located in the chloroplast stroma and is involved in starch metabolism (Feike et al., 2016). DEAR3 is a member of the DREB subfamily ERF/AP2 transcription factors (Sazegari et al., 2015), which is the same subfamily of transcription factors as CBF2.

# CONCLUSIONS

A more comprehensive understanding of local adaptation to stressful environments requires identifying the genetic and physiological changes that confer phenotypic variation, as well as the fitness consequences of such variation in contrasting environments. Detailed molecular studies of traits that have been established as contributing to local adaptation in large multiyear field experiments is perhaps the best approach to connect sequence polymorphism to molecular and organismal phenotypes and ultimately fitness in contrasting environments. Using a novel approach of examining genotype × environment interactions in gene expression using replicate lines that either simulate (CRISPR) or contain (NILs) the loss-of-function mutation in CBF2 found in the IT ecotype, we narrowed the list of candidate targets regulated by CBF2 during cold acclimation to just 10 genes. These 10 genes are excellent candidates for further study of the genetic and physiological changes that underlie the differences in freezing tolerance and local adaptation in these natural populations. As a group, the 10 candidates have likely roles in

desiccation resistance, sugar biosynthesis or starch metabolism, membrane structure and transport, and regulation of transcription, while some of the functions of these genes are unknown or poorly known. The interaction between the CBF2 protein and downstream targets on cold acclimation and local adaptation will be addressed with future growth chamber and field studies to quantify fitness, gene expression, and metabolite production for a set of NILs with pairwise combinations of IT alleles of *CBF2* and each of these 10 genes.

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# **AUTHOR CONTRIBUTIONS**

C.G.O., D.W.S, and M.F.T. conceived the study; C.G.O. and S.P. designed the experiment; S.P. and C.G.O. developed the CRISPR and NIL lines, respectively; M.I.J., S.P., J.C.K, and C.G.O. carried out the experiment; B.J.S, C.G.O., and S.P. analyzed the data and produced the figures; B.J.S. and C.G.O. drafted the manuscript with help from S.P. and M.I.J.; and all authors contributed to revising the manuscript.

# DATA AVAILABILITY

Raw freezing-tolerance data is available as a part of this submission in Appendix S4, and raw RNAseq read data are available in the sequence read archive of NCBI (https://www.ncbi.nlm.nih.gov/biopr oject/PRJNA556985).

## SUPPORTING INFORMATION

Additional Supporting Information may be found online in the supporting information tab for this article.

**APPENDIX S1.** Three transcription factors encoding *CBF* genes in tandem array in the SW and IT ecotypes, and two lines with CRISPR-induced mutations in the *CBF2* gene. Open boxes indicate *CBF1*, *CBF2*, and *CBF3* coding regions (shaded portion indicates DNA binding domain) in the order they are arranged in the genome. The green lines indicate the transcription activation domains. The filled triangle indicates the site of the naturally occurring 13-bp deletion in the IT *CBF2* gene. Open triangles indicate the two independent CRISPR induced deletions. SW:cbf2 a is the same line used by Park et al. (2018).

**APPENDIX S2.** Distribution of mean freezing-tolerance values per cell. The distribution of values for all six lines combined are given in black, and the distribution of values for just IT are given in red.

**APPENDIX S3.** Supplemental methods for calculating differences in cold-responsiveness gene expression.

**APPENDIX S4.** Raw data for the freezing-tolerance assay. Batch describes the three temporally separated replicates of the assay, within each of which there were 60 replicated blocks of lines. The number of plants dead and alive after the freezing period are represented by n\_Dead and n\_Alive, respectively, and freezing tolerance is expressed as a percentage.

**APPENDIX S5.** Heat map of expression differences for the 249 genes that were identified as having a significant genotype × treatment interaction ( $P_{\rm FDR} \leq 0.05$  for the comparison of IT to SW). The value of each cell represents the  $\log_2$ -fold-change in gene expression before and after cold acclimation (counts per million reads). Yellow-red represents genes that are more highly expressed after cold acclimation; black-purple represents genes that are more highly expressed before cold acclimation. The plot was generated using the heatmap.2 function in the R package plots (Warnes et al., 2019).

**APPENDIX S6.** List of genes with significant gene × environment interactions in our study for the pairwise comparison of IT to SW ( $P_{\text{FDR}} \leq 0.05$ ). F, *P* Value, and FDR refer to the significance test of the interaction term.

**APPENDIX S7.** Gene ontology enrichment for the 249 genes with significant genotype × environment interactions for the pairwise comparison of IT to SW ( $P_{\text{FDR}} \leq 0.05$ ).

**APPENDIX S8.** List of genes with significant differences in coldresponsive expression between SW and NIL R37 (P < 0.05), and which are also in Appendix S6. F, *P* Value, and FDR refer to the significance test of the interaction term.

**APPENDIX S9.** List of genes with significant differences in coldresponsive expression between SW and NIL R38 (P < 0.05) and which are also in Appendix S6. F, *P* Value, and FDR refer to the significance test of the interaction term.

**APPENDIX S10.** List of genes with significant differences in cold-responsive expression between SW and CRISPR line SW:cbf2 a (P < 0.05), and which are also in Appendix S6. F, *P* Value, and FDR refer to the significance test of the interaction term.

**APPENDIX S11.** List of genes with significant differences in cold-responsive expression between SW and CRISPR line SW:cbf2 b (P < 0.05), and which are also in Appendix S6. F, *P* Value, and FDR refer to the significance test of the interaction term.

**APPENDIX S12.** Heat map of expression differences for the 10 genes that were identified as having a significant genotype × treatment interaction for all pairwise comparisons to SW. The value of each cell represents the  $\log_2$  fold-change in gene expression before and after cold acclimation (counts per million reads). Yellow-red represents genes that are more highly expressed after cold acclimation; black-purple represents genes that are more highly expressed before cold acclimation. The plot was generated using the heatmap.2 function in the R package plots (Warnes et al., 2019).

**APPENDIX S13.** Relative expression for *GolS3* and *COR413-PM1* quantified by RT-qPCR, normalized to expression of the housekeeping gene *ACT2*. PRE and POST refer to pre-acclimation and post-acclimation tissue collections, respectively. Each biological replicate was run in triplicate for three technical replicates. Points are means of three biological replicates; error bars are the standard error of those means. Primer sequences: *GolS3* F, 5-TGTGCCAAAGCTCCATCCGC-3; *GolS3* R, 5-TGGTGTTGACAAGAACCTCGCT-3; *COR413-PM1* F,5-TGCTGGCACATTCAGAGACAG-3; *COR413-PM1* R,5-CAGA CGGGGAAGACGACGACGAGA-3; *ACT2* F, 5-CTGGATCGGTGGT TCCATTC-3; *ACT2* R, 5-CCTGGACCTGCCTCATCATAC-3.

**APPENDIX S14.** Log<sub>2</sub> counts per million for the least responsive genes of the 10 candidates before (left group of bars) and after (right group of bars) cold acclimation.

**APPENDIX S15.** List of genes with significant gene × environment interactions in our study for the pairwise comparison of IT to SW ( $P_{\text{FDR}} \leq 0.05$ ) that are included among those identified by Gehan et al. (2015).

**APPENDIX S16.** List of genes with significant gene × environment interactions in our study for the pairwise comparison of IT to SW ( $P_{\text{FDR}} \leq 0.05$ ), which were not identified by Gehan et al. (2015).

**APPENDIX S17.** Comparison of genes included in Appendix S12 with previously published CBF regulons from four genetic backgrounds. SW and IT from Park et al. (2018), Col-0 from Zhao et al. (2016), and WS from Park et al. (2015).

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