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Mapping and validation of QTLs for cold tolerance at seedling stage in rice from an *indica* cultivar Habiganj Boro VI (Hbj.BVI)

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Abstract Yellowing, stunting, and seedling death associated with cold stress is a common problem in many Asian countries for winter rice cultivation. Improvement of cultivars through marker-assisted selection of OTLs for cold tolerance at seedling stage from locally adapted germplasm/cultivar is the most effective and sustainable strategy to resolve this problem. A study was undertaken to map QTLs from 151 $F_{2:3}$ progenies of a cross between a cold susceptible variety, BR1 and a locally adapted traditional indica cultivar, Hbj.BVI. A total of six significant OTLs were identified for two cold tolerance indices-cold-induced leaf discoloration and survival rate after a recovery period of seven days on chromosomes 6, 8, 11, and 12. Among these QTLs, qCTSL-8-1 and qCTSS-8-1 being co-localized into RM7027–RM339 on chromosome 8 and qCTSL-12-1 and qCTSS-12-1 into RM247-RM2529 on chromosome 12 showed 12.78 and 14.96% contribution, respectively, to the total phenotypic variation for cold tolerance. Validation of QTL effect in BC1F3 population derived a cross between a cold susceptible BRRI dhan28 and

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Hbj.BVI showed dominating effect of qCTSL-12-1 on cold tolerance at seedling stage and it became stronger when one or more other QTLs were co-segregated with it. These results suggest that the QTLs identified in this study are stable and effective on other genetic background also, which warrant the use of these QTLs for further study aiming to cultivar development for seedling stage cold tolerance.

Keywords Cold tolerance at seeding stage · Leaf discoloration · Survivability rate · Quantitative trait loci · *Indica* rice

Introduction

Low temperature is a major abiotic stress affecting growth and development of rice plants and constraints sustainable rice production in many countries of the world (Maclean et al. 2002). Cold stress at early vegetative stage of rice plants causes stunted growth and increased seedling mortality that eventually lead to uneven seedling stand establishment (Nakagahra et al. 1997). It can lead to leaf discoloration or yellowing, leaf rolling or wilting, stunted growth, delayed heading, and subsequently decreased yield of rice (Kaneda and Beachell 1973; Yoshida et al. 1996; Andaya and Mackill 2003; Fujino et al. 2004; Suh et al. 2010). Therefore, improvement of cold tolerance at seedling stage of rice has been an important issue to guarantee fast recovery and uniform crop stand (Krishnasamy and Seshu 1989) and ultimately higher yield, particularly in the rice crops which are grown in the winter season. However, breeding for cold tolerance at seedling stage has been difficult due to its polygenic nature and inadequate knowledge on genetic architecture.



With the advent of molecular biology, several reports on QTLs for cold tolerance at seedling stage in rice are available. Until now, more than 80 QTLs have been reported (Singh et al. 2016; Qian et al. 2000; Andaya and Mackill 2003; Zhan et al. 2005; Han et al. 2004, 2007; Lou et al. 2007; Jiang et al. 2008; Koseki et al. 2010; Suh et al., 2012) for cold tolerance at seedling stage in rice. In summary. Andaya and Mackill (2003) mapped a major QTL associated with cold-induced necrosis and wilting tolerance on chromosome 12 from a RIL population of $M202 \times IR50$, which was fine mapped later on by Andaya and Tai (2006). Lou et al. (2007) mapped five main effect QTLs for survival percentage after cold treatment on chromosomes 1, 2, and 8 from a double of AAV002863 \times Zhenshan97B. haploid population Koseki et al. (2010) identified and fine mapped a major QTL on chromosome 11 from Oryza rufipogon. Han et al. (2004) identified three QTLs on chromosomes 1, 5, and 9 from a cross between Milyang23 \times Jileng. Han et al. (2007) mapped 12 QTLs on chromosomes 1, 2 7, 8, and 12 from a $F_{2:3}$ population of Milyang 23 × Jileng. Ji et al. (2010) reported five QTLs for seedling stage cold tolerance on chromosomes 1, 2, 4, 10, and 11 from a double haploid population of $TN1 \times Chunjiang 06$. Park et al. (2013) mapped four QTLs on chromosomes 2 and 5 from a cross between Milyang $23 \times$ Hapcheonaengmi3. Suh et al. (2012) identified two QTLs on long and short arms of chromosome 4 from a RIL population of Guemobyeo and IR66160-121-4-4-2. Kim et al. (2014) mapped six OTLs associated with cold tolerance at seedling stage from a RIL population of BR29 × Jinbubyeo and developed gene-based markers for two candidate genes that are located on chromosomes 1 and 11. From an RIL population of Lijiangxintuanheigu × Sanhuangzhan-2, Zhang et al. (2014) mapped four OTLs on chromosomes 1, 6, 9, and 12 for seedling yellowing and percent seedling survival after cold water irrigation and five QTLs on chromosomes 7, 8, 9, 11, and 12 responsible for leaf rolling under low-temperature exposure in phytotron. It is noticeable that all of these studies identified QTLs from Japonica germplasm; however, there only few reports available that exploited *indica* germplasms (Wang et al. 2016) for cold tolerance at seedling stage. Identification and use of QTLs from *indica* germplasm in the breeding program might be helpful and low cost for the improvement of cold tolerance in *indica* rice avoiding undesirable linkage drag from japonica donors. Thus, a study was undertaken to map QTLs from Hbj.BVI, a traditional indica cultivar, which showed stronger cold tolerance at seedling stage than other japonica donor parents (BRRI 2013; Khatun and Biswas 2015; Kundu 2015).



Materials and methods

Plant materials

A set of 151 $F_{2:3}$ lines derived from a cross between a cold susceptible high yielding variety, BR1, and a cold tolerant cultivar, Hbj.BVI were used in this study. Hbj.BVI is a pure line selection of *Poshusail*, a local variety, which is still grown in some parts of Northeastern districts of Bangladesh. On the other hand, BR1 was released in Bangladesh in 1973 through introduction of IR532-1-176 (developed from a cross between IR262-24-3 and TKM6) from IRRI, but later, studies found it highly susceptible to cold stress at seedling stage (Biswas et al. 2012). Japonica variety Jinbubyeo, Guemmbyeo, and M202 were used as cold tolerant check varieties, and IR50 and Milyang23 were used as susceptible check varieties in this study. For validation of OTL effect, BC₁F₃ lines derived from a cross between BRRI dhan28 (a high yielding but susceptible to cold stress at both seedling and reproductive stage) and Hbj.BVI were used. BC1F3 lines of BRRI dhan28 × Hbj.BVI were developed through the conventional backcrossing method. The F1 plants were identified comparing morphological traits of the both parents. BRRI dhan28 was used as recurrent parent in making BC_1F_1 which followed two successive selfing generations to make BC₁F₃.

Evaluation of cold tolerance at seedling stage

Parents, check varieties, and $F_{2:3}$ progenies were evaluated under artificial cold stress condition using cold water irrigation in cold water tank in 2014 following the protocol described in Khatun et al. (2016) with slight modification. Briefly, 30 seedlings of each of parents, check varieties, and F_3 families were raised in plastic trays filled with gravel free fertilized soil. Each tray accommodated 30 lines including two parents at either side. The seedlings were allowed to grow until 3-leaf stage, and then, the trays were placed in the cold water tank preset at a constant temperature of 10 °C (Fig. 1). Cold water stress was withdrawn at 7 days after treatment or until the susceptible check variety dies. The trays were pulled out from cold water and allowed them to settle in ambient temperature. Leaf discoloration (LD) score was recorded immediately based on an arbitrary scale of 1 (green plants) to 9 (almost dead plants) following standard evaluation system (SES) for rice (IRRI 2013), as shown in Fig. 1. Survivability was recorded at 7 days of recovery period after withdrawal of cold treatment as the percentage of green plants to the total plants tested per family. The experiment was conducted in three replicates. One-way analysis of variance (ANOVA) procedures in Statistix 10.0 was used to analyze variance and co-efficient of correlation



Fig. 1 Evaluation of parents and $F_{2:3}$ mapping population for seedling stage cold tolerance under cold water irrigation with constant 10 °C temperature. **a** Shows plants are at cold water treatment in cold water tank, **b** shows different LD scales (1–9) used in this study

for the cold tolerance indices of the parents and 151 $F_{2:3}$ progenies. Heritability in broad sense was estimated from the genetic components obtained from the ANOVA. Mean differences between parents were compared by Student's *t* test at 5 and 1% level of significance.

Genotyping of parents and F_2 population

Genomic DNA was extracted from leaf tissues of parents and 151 F₂ plants. Total DNA was extracted following modified miniprep CTAB method as described in Das and Biswas (2017). Six hundred and twenty SSR markers distributed over 12 chromosomes were analyzed following the protocol described in Syed et al. (2016) to identify polymorphic markers between BR1 and Hbj.BVI. Briefly, PCR reaction was performed with a 10 μ l reaction mixture containing 2 μ l of DNA template of 25 ng/µl conc., 4.25 µl sterile water, 1 µl 10× TB buffer (200 mMTris-HCl pH 8.3, 500 mMKCl), 1.35 µl of 25 mM MgCl₂, 0.2 µl of 10 mM dNTPs, 0.5 µl each of 10 µM forward and reverse primers, and 0.20 µl of Taq DNA polymerase (5 U/µl). Gel electrophoresis of the amplified PCR products was performed in 6% polyacrylamide gel containing 0.5X TBE buffer at 100 V for 1.5-2.5 h along with a known DNA ladder. F_2 plants were genotyped with 127 polymorphic SSR markers. Allele scoring of the F_2 plant was performed based on the relative positions of DNA bands comparative to the parental bands.

Construction of linkage map, detection of QTLs, and candidate gene analysis

A linkage map was constructed based on Kosambi function using QTL mapping tool QTL IciMapping version 4.0 (http://www.isbreeding.net/software/?type=detail&id=14).

A total of 127 SSR markers were used in construction of linkage map. A Chi-square test (P < 0.01) was used to

identify markers with distorted segregation. An LOD value of 3.0 was used for estimation of map distance. QTL analysis was performed using composite interval mapping option in QTL IciMapping. The QTLs were declared with threshold LOD at 5% level of significance in permutation test with 1000 iterations. QTLs were named following the nomenclature system proposed by McCouch et al. (1997), and McCouch and CGSNL (2008). The marker intervals of all the significant QTLs were analyzed in silico for the presence of candidate genes. The physical distance of the QTLs was obtained from Gramene annotated Nipponbare sequence map (http://www.gamene.org) based on the position of the flanking markers. BAC clones and candidate gene information were obtained from Rice Genome Annotation Project (http://rice.plantbiology.msu.edu) and annotation database of NCBI (https://www.ncbi.nlm.nih.gov).

Validation of QTL in BC₁F₃ lines of BRRI dhan28XHbj.BVI

A set of 87 BC_1F_3 lines derived from a cross between BRRI dhan28 and Hbj.BVI was tested for seedling stage cold tolerance. Selected tolerant and susceptible lines were genotyped using flanking markers of the QTLs identified in this study. Efficacy and relative competency of expressing cold tolerance by the QTLs either singly or in combination were assessed on BRRI dhan28 background.

Results

Phenotypic evaluation of parents and mapping population

Significant differences were observed between the parents in LD and % survivability (Table 1). Under cold stress,



BR1 showed very high average LD value (8.7 \pm 0.33) and very low survivability rate $(4.6 \pm 2.39\%)$, while low average LD (2.4 ± 0.76) and very high survivability $(79.5 \pm 3.88\%)$ rate were observed with Hbj.BVI, which indicated that Hbj.BVI was highly tolerant to cold stress. Phenotypic evaluation of indica and japonica parents under cold water irrigation also showed that Hbj.BVI had stronger cold tolerance than the *japonica* cold tolerant varieties (Fig. 2). The 151 $F_{2:3}$ progenies showed significant variation in both of the cold tolerant indices and no significant variation was observed in any indices between the replicates. The LD values ranged from 1.8 to 9.0, while % survivability varied from 0 to 100%. A continuous and transgressive variation with bimodal frequency distribution was observed for LD, while % survivability showed a discrete but still bimodal distribution with transgressive variations (Fig. 3). However, at least 50% increase in cold tolerance over susceptible parent BR1 was observed in 46.4% families for LD and 60.3% families for survivability among $F_{2:3}$ progenies (Table 1). The heritability estimates of LD and % survivability were also observed quite high. LD value was found significant and negatively correlated with % survivability.

SSR analysis and linkage map construction

Out of 620 SSRs analyzed, 226 markers were found polymorphic between BR1 and Hbj.BVI. Maximum polymorphism rate (51.2%) was observed on chromosome 8 and minimum (18.6%) on chromosome 2 (Supplementary Table 1). Among the polymorphic markers, many of them were very close to each other, and in some other cases, the intervals between adjacent markers were comparatively higher (up to 36.8 cM) (Supplementary Fig. 1). The linkage map was constructed with 127 polymorphic SSR markers showing no distorted segregation and more or less evenly distributed over 12 chromosomes (Supplementary Fig. 2). Out of 127 SSRs, 15 markers were distributed on chromosome 1; 12 markers on each of chromosomes 2 and 3; 10 markers on each of chromosomes 4, 7, and 11; nine markers on each of chromosomes 5 and 9; 13 markers on chromosome 8 and eight markers on each of chromosomes 9 and 12. The map covered 1407.2 cM of the rice genome with an average interval of 10.99 cM. There were still five marker intervals bigger than 20 cM—one on each of chromosomes 3, 4, 5, 7, and 12.

QTL analysis

A total of six significant QTLs were localized for two cold tolerance indices on chromosomes 6, 8, 11, and 12. These QTLs and their chromosomal position, linked makers, additive effects, and contributions in explaining phenotypic variations were given in Table 2. Among six QTLs, qCTSL-6-1, qCTSL-8-1, and qCTSL-12-1 for LD were located on chromosomes 6, 8, and 12 with bordering markers RM19996-RM3, RM7027-RM339, and RM247-RM2529, respectively (Fig. 4). The phenotypic contributions of these OTLs were 7.29, 12.78, and 14.96%, respectively. While, three QTLs-qCTSS-8-1, qCTSS-11-1, and qCTSS-12-1 with flanking markers, RM7027-RM339, RM26324-RM7283, and RM247-RM2529, respectively, were mapped on chromosomes 8, 11, and 12 for % survivability. The qCTSS-8-1, qCTSS-11-1, and qCTSS-12-1 had phenotypic variance of 12.79, 8.70, and 13.06%, respectively. The additive effects of the QTLs for LD were negative in direction, while positive additive effects were observed for the QTLs governing % survivability.

Candidate gene analysis

Among six QTLs, *qCTSL-6-1*, *qCTSL-8-1*, *qCTSS-11-1*, and *qCTSL-12-1* were analyzed for underlying candidate genes. The annotation information of the candidate genes is

Cold tolerance indices	Parent		$F_{2:3}$ population ($n = 151$)					
	$\frac{BR1}{(n=18)}$	Hbj.BVI $(n = 18)$	Range	Average	Co-efficient of variation (%)	Families with \geq 50% increase of cold tolerance over BR1 (%)	Heritability (%)	p value
LD score	8.7 ± 0.33	$2.4 \pm 0.76^{**}$	1.8–9.0	5.4	23.09	46.4	72.8	< 0.0001
% Survivability	4.6 ± 2.39	$79.5 \pm 3.88^{**}$	0-100	39.1	40.9	60.3	83.4	< 0.0001
Correlation betw	veen LD and	% Survivability			-0.812**			

Table 1 Phenotypic values of cold tolerance indices among parents and $F_{2:3}$ progenies under artificial cold water treatment at seedling stage of rice

LD leaf discoloration score

**Significance at the level of 1% of probability



Fig. 2 Cold response of parental lines with japonica cold tolerant varieties at 10 °C cold water irrigation in cold water tank for 10 days. Jinbyeo, Guembyeo, and M202 (IRGC68815) are cold japonica varieties, and IR50 and Milyan 23 are cold susceptible varieties





Fig. 3 Frequency distribution of two different cold tolerances indices among $F_{2:3}$ progenies

Fable 2 List of QTLs detected for two cold tolerance indices in an $F_{2:3}$ population of BRRI dhan28 >	< Hbj.BVI	
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QTL name	Chromosome	Bordering marker	LOD	Phenotypic contribution (%)	Additive effect	
Leaf discoloration	(LD)					
qCTSL-6-1	6	RM19996-RM3	4.05	7.29	- 0.607	
qCTSL-8-1	8	RM7027-RM339	6.62	12.78	- 0.715	
qCTSL-12-1	12	RM247-RM2529	6.52	14.96	- 0.675	
% Survivability						
qCTSS-8-1	8	RM7027-RM339	5.78	12.79	15.989	
qCTSS-11-1	11	RM26324-RM7283	4.44	8.70	14.958	
qCTSS-12-1	12	RM247-RM2529	5.29	13.06	16.121	

q indicates QTL, CTSL indicates seedling stage cold tolerance with LD score, CTSS indicates seedling stage cold tolerance with survivability rate, LOD logarithm of odds

given in Table 3. In total, 27 putative candidate genes, responsible cold tolerance, were identified from 1638 ORFs present in the marker intervals of all four QTLs. For LOC_Os06g30780, qCTSL-6-1, four loci LOC_Os06g30690, LOC_Os06g30310, and LOC_Os06g26340 encoding, respectively-acyl-desaturase (chloroplast precursor), alcohol oxidase related protein. alpha-glucan water dikinase, and CGMC MAPKCMGC 2.10-CGMC includes CDA. MAPK, GSK3, and CLKC kinases were found to be related with cold acclimatization. LOC_Os08g27170 for calmod-LOC Os08g27860 ulin-binding protein, and LOC_Os08g27870 for early flowering protein, LOC_Os08g27850 for endothelial differentiation-related factor 1, LOC Os08g29100 for SAM domain family protein, and LOC_Os08g29110 for Thioredoxin were identified in the marker interval of qCTSL-8-1. On the other LOC_Os11g14040, hand, LOC_Os11g14050, and LOC_Os11g14900 encoding glutathione S-transferase, N-terminal domain containing protein, leucine-rich repeat



Fig. 4 Chromosomal locations of QTLs for cold tolerance at seedling stage with two different tolerance indices



family protein, and thiol protease SEN102 precursor, respectively, were identified as putative candidate genes of *qCTSS-11-1*. А total of 14 ORFs including LOC Os12g07230 and LOC_Os12g12860 encoding CAMK CAMK like.45—CAMK includes calcium/calmodulin-dependent protein kinases, LOC Os12g07610 and LOC Os12g07640 encoding MYB family transcription factor, LOC_Os12g10720 and LOC Os12g10730 encoding Glutathione S-transferase and LOC Os12g12730 encoding OsCML28-calmodulin-related calcium sensor protein were identified as putative candidate genes in the marker interval of qCTSL-12-1.

Validation of QTL in BC_1F_3 lines of BRRI dhan28 × Hbj.BVI

BC₁F₃ lines of BRRI dhan28 × Hbj.BVI showed wide range of variation in LD values under cold water treatment at seedling stage. Out of 87 lines tested, we found 53 lines showing tolerant (LD score: 1–3) to moderately tolerant (LD score: 5) reaction (Fig. 5). Genotyping of 60 BC₁F₃ plants including five susceptible plants and two parents with bordering SSR markers of *qCTSL-6-1*, *qCTSL-8-1*, *qCTSS-11-1* and *qCTSL-12-1* showed that 49 lines had positive results for at least one flanking markers for one or more QTLs. We further scrutinized the lines for the presence of positive results (homozygous Hbj.BVI alleles) at both flanking markers for



the QTLs. Out of 49, seven lines showing tolerance reaction to cold stress (Fig. 6) had both flanking markers homozygous for Hbj.BVI alleles for at least two QTLs including qCTSL-12-1 except two lines (F and G). The line F and G possessed combination of two QTLs, qCTSL-6-1 + qCTSL-8-1 and qCTSL-8-1 + qCTSS-11-1, respectively. On the other hand, the lines carrying single QTL, qCTSL-6-1 (line K), or qCTSS-11-1 (line M) showed susceptible reaction except line H, which contained qCTSL-12-1 and showed tolerant reaction. However, the line (I) containing both qCTSL-6-1 and qCTSS-11-1 showed moderate tolerance to cold stress.

Discussion

In general, rice genotypes belonging to *japonica* subspecies represents higher cold tolerance than *indica*, but there is variability within the subspecies. Rice crop in tropical and sub-tropical regions where *indica* rice is commonly cultivated is usually affected by low temperature at early vegetative stage limiting growth, delaying flowering that eventually results into low yield. However, most of the breeding programs and QTL mapping works across the world used *japonica* donors for seedling stage cold tolerance (Qian et al. 2000; Andaya and Mackill 2003; Zhan et al. 2005; Han et al. 2004, 2007; Lou et al. 2007; Jiang et al. 2008; Koseki et al. 2010; Ji et al. 2010; Suh et al.

Table 3 Putative candidate genes for cold tolerance in the marker intervals of target QTL regions

Locus name	Putative function	Predicted length (bp)	No. of exons
Target region for qCTSL-6	5-1: 14.4–19.5 Mb		
LOC_Os06g30780	Acyl-desaturase, chloroplast precursor, putative, expressed	570	1
LOC_Os06g30690	Alcohol oxidase-related, putative, expressed	818	2
LOC_Os06g30310	Alpha-glucan water dikinase, chloroplast precursor, putative, expressed	12350	33
LOC_Os06g26340	CGMC_MAPKCMGC_2.10—CGMC includes CDA, MAPK, GSK3, and CLKC kinases, expressed	8754	10
Target region for qCTSL-8	8-1: 15.8–17.9 Mb		
LOC_Os08g27170	Calmodulin-binding protein, putative, expressed	2980	8
LOC_Os08g27860, LOC_Os08g27870	EARLY flowering protein, putative, expressed	2894, 2289	3, 2
LOC_Os08g27850	Endothelial differentiation-related factor 1, putative, expressed	3245	4
LOC_Os08g29100	SAM domain family protein, expressed	3131	1
LOC_Os08g29110	Thioredoxin, putative, expressed	2098	3
Target region for qCTSS-1	1-1: 7.4–9.1		
LOC_Os11g14040	Glutathione S-transferase, N-terminal domain containing protein, expressed	2698	9
LOC_Os11g14050	Leucine-rich repeat family protein, putative, expressed	6063	19
LOC_Os11g14900	Thiol protease SEN102 precursor, putative, expressed	2695	4
Target region for qCTSL-1	2-1: 3.2-7.5 Mb		
LOC_Os12g07230, LOC_Os12g12860	CAMK_CAMK_like.45—CAMK includes calcium/calmodulin dependent protein kinases, expressed	5005, 3919	7, 6
LOC_Os12g07610, LOC_Os12g07640	MYB family transcription factor, putative, expressed	1833, 1474	3, 3
LOC_Os12g07810	Aldehyde dehydrogenase, putative, expressed	8803	10
LOC_Os12g07820, LOC_Os12g07830	OsAPx6-stromal ascorbate peroxidase encoding gene 5,8, expressed	3838, 3490	11, 11
LOC_Os12g09060	Trehalose phosphatase, putative	3238	8
LOC_Os12g10720, LOC_Os12g10730	Glutathione S-transferase, putative, expressed	3653, 3516	10, 10
LOC_Os12g10740, LOC_Os12g12740	Leucine-rich repeat family protein, putative, expressed	7430, 5346	19, 15
LOC_Os12g12730	OsCML28-calmodulin-related calcium sensor protein, expressed	662	1
LOC_Os12g13380	Adenylate kinase, putative, expressed	3896	6

2012; Park et al. 2013; Yang et al. 2013; Kim et al. 2014; Ranawake et al. 2014; Zhang et al. 2014). A very few work using *indica* donors has been reported so far. Wang et al. (2016) used a rice diversity panel comprising japonica, indica, and aus cultivars to map QTLs for seedling stage cold tolerance. In a previous study, we identified Hbj.BVI as a potential indica donor for cold tolerance at seedling stage (BRRI 2013; Khatun and Biswas 2015). From a haplotype analysis study with marker information of the reference QTLs identified from different japonica donors, Kundu (2015) reported that Hbj.BVI showing better tolerance to cold stress at seedling stage was grouped into a different cluster from the other *japonica* donors such as, M202, Jinbubyeo, IR66160-121-4-4-2, Jinbubyeo, and Jinbubyeo derived lines. Phenotypic evaluation with japonica cultivars as cold tolerant check varieties also showed strong evidence that Hbj.BVI had higher cold tolerance at seedling stage (Fig. 2). These results clearly indicated that Hbj.BVI might be a potential *indica* donor. Mapping of QTLs from Hbj.BVI, thus, might be helpful in developing high yielding cold tolerant *indica* rice. Although high-throughput and robust genotyping techniques are available for maker-assisted breeding, smallscale breeding program of public sectors can reliably use *indica* donor in the breeding program without shouldering robust budget to minimize undesired linkage drags from *Japonica* donors into the introgression lines.

The most crucial step of a QTL mapping work is phenotyping, particularly for seedling stage cold tolerance. Plants' responses to cold stress are a complex phenomenon and are highly influenced by environment. Thus, the extent of low temperature and duration of exposure are extremely



QTL name	Marker interval (Mb)	Reference QTL at the proximity					
_		QTL name	Flanking markers	Interval between linked markers (bp)	References		
qCTSL-6-1	14.4–19.5	qCTS6	RM161-RM340	20.9–28.6	Liu et al. (2013)		
		qCTS-6	RM30-RM400	19.5–28.4	Zhang et al. (2014)		
		qCTS6-2	RM3-RM325	19.4–25.8	Andaya and Mackill (2003)		
qCTSL-8-1/	15.8–17.9	qCTS8-1	-	21.1–25.2	Yang et al. (2013)		
qCTSR-8-1		qCTS8-1	RM284-RM230	21.1–25.8	Andaya and Mackill (2003)		
		qCTS8-2a	RM223-RM284	20.6–21.1	Andaya and Mackill (2003)		
		qCTS8-2b	RM223-RM284	20.6–21.1	Andaya and Mackill (2003)		
		qCTS8	RM152-RM506	0.7–15.3	Lou et al. (2007)		
qCTSR-11-1	7.4–9.1	qCTS11(1)-1	RM167-RM202	4.0–9.0	Ranawake et al. (2014)		
		qGAS11	RM167–RM287	4.0–16.8	Han et al. (2004)		
		qSCT-11	RM202-RM209	9.0–17.8	Zhang et al. (2005)		
qCTSL-12-1/	3.2–7.5	qCTS-12	RM27628-RZ397	3.8–5.8	Zhang et al. (2014)		
qCTSS-12-1		qCTS12a	RM101-RM292	8.8–9.6	Andaya and Mackill (2003)		
		qCTS12b	RM101-RM292	8.8–9.6	Andaya and Mackill (2003)		
		qSDW12	RM19-RM270	2.4–17.8	Han et al. (2007)		

Table 4 Comparative position of mapped and reference QTLs for cold tolerance at seedling stage in rice

important for effective evaluation of cold tolerance. In different previous studies, different temperature regimes and durations of exposure were used to test cold tolerance of rice at seedling stage. Some studies used constant temperature varying from 4 to 12 °C (Zhan et al. 2005; Andaya and Mackill 2003; Qu et al. 2003; Han et al. 2005a, b) and some others used variable temperature over day to night (20/13 °C by Park et al. 2013, 10/6 °C by Qian et al. 2000). Khatun et al. (2016) reported that cold water irrigation with constant 13 °C in cold water tank at 3-leaf stage-seedlings of rice for 7 days is sufficiently enough to discriminate cold tolerant varieties from intolerant ones, and it is as good as constant 10 °C treatment. Yoshida (1981) reported 10 °C as the minimum critical value, below which rice seedlings get yellowing and stunted growth and loses potency to survive (Yoshida 1981). In our study, we used constant 10 °C cold water irrigation for cold screening at seedling stage. Usually cold stress at seedling stage of rice manifests different symptoms of cold response, such as leaf rolling, yellowing, wilting, seedling growth retardation, seedling death, and so on. Some indices reflecting these phenomena are used to evaluate cold response. Cold-induced leaf discoloration (Andaya and Mackill 2003; Han et al. 2005a, b), seedling survivability (Qian et al. 2000; Chen et al. 2002; Qu et al. 2003; Lou et al. 2007; Zhang et al. 2014), seedling vigor under cold stress (Zhang et al. 2005), and germination rate (Lee et al. 2001; Sheng et al. 2001; Chen et al. 2006; Dashtmian et al. 2013) are widely used indices of assessing cold response. Leaf yellowing or discoloration and survivability rate under low-temperature stress are directly related to seedling mortality in the seedbed and in



the main field immediately after transplanting. In fact, seedling mortality in the seedbed and in the main field is very common in rice crop that is grown in winter season in South Asian countries including Bangladesh. Considering this fact, in our study, we phenotyped an $F_{2:3}$ population of 151 individuals and their parents for cold-induced LD and % survivability after a recovery period of seven days from cold stress withdrawal. The $F_{2:3}$ progenies showed significant and wide variation in both LD and % survivability ranging from 1.8-9.0 to 0-100%, respectively. While, the parental values for LD were 8.7 ± 0.33 and 2.4 ± 2.39 and 4.6 \pm 0.76 and 79.5 \pm 3.88 for % survivability. It is clearly evident that the ranges of variation in both of the indices of the mapping population exceeded the parental range (Table 1) indicating the presence of transgressive segregants. Syed et al. (2016) observed similar results for arsenic phyto-toxicity tolerance, Mohiuddin (2016) for grain zinc content, Swamy et al. (2011, 2014) for yield and yield related traits, Zhang et al. (2014) for cold-induced yellowing tolerance and wilting tolerance, and Park et al. (2013) for SPAD value of rice seedlings under cold stress. It is worthy to note that at least 50% increase of cold tolerance over susceptible parent BR1 was observed in 46.4% families for LD and 60.3% families for survivability among the $F_{2:3}$ progenies. However, the variation was continuous and bimodal for LD, and for % survivability, it was discrete but still bimodal among the $F_{2:3}$ progenies. Bimodal distribution was reported by Swamy et al. (2012) in amylose content of rice, Kuroki et al. (2009) for heading date under cold stress in rice, and Andaya and Tai (2006; 2007) for CT score at seedling stage. The above findings



Fig. 5 Distribution of 87 BC_1F_3 families of BRRI dhan28 × Hbj.BVI into different cold-induced LD classes upon cold water irrigation of constant 10 °C for 7 days

indicated that both major and minor QTLs for LD and major QTLs for % survivability might involve in the mapping population of this study.

Using LD scores and survivability rate as cold tolerance indices and genotyping data with 127 polymorphic SSR markers distributed at an average interval of 10.99 cM over 12 chromosomes, we mapped three QTLs-one at each of chromosomes 6, 8, and 12 for cold-induced LD and three QTLs—one at each of chromosomes 8, 11, and 12 for % survivability accounting 35.03 and 34.55% cumulative contribution to the total phenotypic variation, respectively. Among these QTLs, qCTSL-8-1 for LD and qCTSS-8-1 for % survivability were located into the same marker interval (RM7027-RM339) on chromosome 8. In addition, the qCTSL-12-1 for LD and qCTSS-12-1 for % survivability were co-located into the same RM247-RM2529 marker interval on chromosome 12. Very high and significant correlation among the indices also supports of co-localization of one or more QTLs conferring these traits. The co-localized QTLs might be the same QTLs or overlapped QTLs affecting two or more traits. Co-localized QTLs were



Fig. 6 QTL effect between tolerant and susceptible BC_1F_3 families, the bar divided by different colors indicates four QTLs associated with phenotypic variance for cold tolerance of each QTL. The letter A, B, C, D, E, F, G, H, I, J, K, and L indicated BC_1F_3 families, BC_1F_3 -14-2, BC_1F_3 -14-9, BC_1F_3 -26-7, BC_1F_3 -26-12, BC_1F_3 -26-22, BC_1F_3 -29-3, BC_1F_3 -29-5, BC_1F_3 -29-10, BC_1F_3 -132-1, BC_1F_3 -132-6, BC_1F_3 -132-11, and BC_1F_3 -132-18, respectively. T, MT, and S indicated tolerant, moderately tolerant, and susceptible, respectively

also reported earlier by Wang et al. (2012) for salinity tolerance in rice at seedling stage, Andaya and Mackill (2003), Han et al. (2004, 2007), Zhang et al. (2014) for cold tolerance at seedling stage in rice. These co-localized QTLs might be useful in simultaneous improvement of one or more traits as the desirable alleles of these QTLs were contributed by a single parent. The positive and negative additive effects of all the significant QTLs for % survivability and LD, respectively, indicated that increasing frequency of favorable alleles from Hbj.BVI has resulted into increased in survival rate and decreased in LD values, i.e., tolerance to cold stress at seedling stage in terms of survivability and LD score in the $F_{2:3}$ population.

The cross validation with the previous studies for the physical position in the rice genome showed that the newly identified QTLs from this study were located at the proximity of the QTLs reported in other previous studies (Table 4). The qCTSL-6-1, which was mapped at 14.4-19.5 Mb on chromosome 6, was located near the QTLs identified by Liu et al. (2013), Zhang et al. (2014) and Andaya and Mackill (2003). The qCTS6 identified by Liu et al. (2013) at 20.9–28.6 Mb, was just at 1.4 Mb upstream of *qCTSL-6-1*, while, the *qCTS-6* identified by Zhang et al. (2014) at 19.5–28.4 Mb and *qCTS6-2* reported by Andaya and Mackill (2003) at 19.4-25.8 Mb were located at tandem with qCTSL-6-1. The qCTSS-11-1, which was mapped at 7.4-9.1 Mb on chromosome 11, was found into the marker interval of *qGAS11* reported by Han et al. (2004) at 4.0-16.8 Mb. Ranawake et al. (2014) also mapped qCTS11 (1)-1 at marker interval of 4.0-9.0 Mb in which we mapped qCTSS-11-1. However, the marker intervals of qGAS11 and qCTS11 (1)-1 were much bigger (10.1 and 2.3 Mb, respectively) than that of *qCTSS-11-1*. Furthermore, Zhang et al. (2005) mapped a major QTL (*aSCT-11*) for seedling stage cold tolerance, which is tandemly located with qCTSS-11-1 at 9.0-17.8 Mb. On the other hand, qCTSL-8-1 and qCTSS-8-1, which were colocalized at 15.8–17.9 Mb on chromosome 8, were mapped at 3.2 Mb upstream of the *qCTS8-1* reported by Yang et al. (2013). However, Andaya and Mackill (2003) mapped three QTLs (qCTS8-1, qCTS8-2a and qCTS8-2a) at 2.7-3.2 Mb downstream of qCTSL-8-1. Besides, the other two co-localized QTLs (qCTSL-12-1 and qCTSS-12-1), which were mapped at 3.2-7.5 Mb on chromosome 12, in this study, were found in the vicinity the QTLs reported by Zhang et al. (2014) and Han et al. (2007). However, marker interval of the QTLs reported by Zhang et al. (2014) and Han et al. (2007) was, respectively, 2.3 Mb smaller and 11.1 Mb bigger than of that of the QTLs identified in this study. Interestingly, Andaya and Mackill (2003) mapped a major QTL (qCTS12) at 1.3 Mb upstream of our QTLs on chromosome 12. The above findings indicated that the QTLs identified in this study are reliable and stable in



different genetic background and we mapped QTLs with relatively smaller marker interval in the proximity of previously identified QTLs except few cases. When we analyzed the marker intervals of the OTLs for the presence of candidate gene in silico, we found at total of 27 putative candidate genes, of which 4 were for qCTSL-6-1, 6 for qCTSL-8-1, 3 for qCTSS-11-1, and 14 for qCTSL-12-1. These results clearly indicated that seedling stage cold tolerance in this study was governed by many genes situated at different QTL regions with preponderance share of *qCTSL-12-1*. Among the putative candidate genes, LOC Os11g14040 in *qCTSS-11-1* and, LOC Os12g10720 and LOC_Os12g10730 in qCTSL-12-1 encoding glutathione S-transferase and LOC_Os12g07230 and LOC_Os12g12860 encoding CAMK_CAMK_like.45-CAMK includes calcium/calmodulin-dependent protein kinases and LOC_Os12g12730 encoding OsCML28calmodulin-related calcium sensor protein in qCTSL-12-1 are considered as important factor for cold tolerance (Doherty et al. 2009). Calmodulin-binding transcription activator governing cold tolerance pathway in rice was also reported earlier by Kim et al. (2014) in japonica germplasm Jinbubyieo. We located LOC Os12g07610 and LOC_Os12g07640 in qCTSL-12-1, which encode calciumdependent MYB family transcription factor that mediates cold signaling pathways. Su et al. (2010) reported that over-expressing MYBS3 transgenic rice lines showed tolerance to 4 °C for at least 1 week. The above findings suggest that the QTLs identified in this study have much worth in transferring from Hbj.BVI into other genetic background to develop high yielding cultivars tolerant to cold stress at seedling stage.

We validated the QTLs mapped in this study in a BC_1F_3 population derived from a cross between BRRI dhan28 and Hbj.BVI. Phenotyping under cold water irrigation followed by genotyping of selected 53 tolerant to moderately tolerant lines and five susceptible lines with their parents using flanking SSRs of qCTSL-6-1, qCTSL-8-1, qCTSS-11-1, and CTSL-12-1 showed that the lines having two or more QTLs including qCTSL-12-1 were tolerant to cold stress and lines with single QTL except qCTSL-12-1 were susceptible. The line with single qCTSL-12-1 showed tolerant reaction. On the other hand, the lines which contained combination of two QTLs other than *qCTSL-12-1* also showed tolerance reaction. These indicated that qCTSL-12-1 has dominating effect on cold tolerance at seedling stage and it became stronger when one or more other QTLs were co-segregated with it. These results suggest that the QTLs identified from Hbj.BVI are stable in different genetic backgrounds, which warrant the use of these QTLs for further study aiming to cultivar development for seedling stage cold tolerance. In addition, MAS with linked markers of qCTSL-12-1 in combination with one or more of qCTSL-6-1, qCTSL-8-1,



and *qCTSS-11-1* might increase cold tolerance in the pyramided lines.

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Compliance with ethical standards

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Conflict of interest There is conflict of interest.

Ethical approval This article does not contain any studies with human participants or animals by any of the authors.

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