



Mapping Some Seed Quality Traits in Bread Wheat (*Triticum aestivum* L.) by Association Mapping Using SSR Markers

Reza Mir Drikvand^{1*}, Goodarz Najafian², Mohammad Reza Bihamta³, Asa Ebrahimi⁴

¹Department of Agronomy and Plant Breeding, Khorramabad Branch, Islamic Azad University, Khorramabad, Iran

²Cereal Chemistry and Technology Unit, Seed and Plant Improvement Institute, Karaj, Iran

³Department of Agronomy and Plant Breeding, University of Tehran, Iran

⁴Department of Plant Biotechnology, Science and Research Branch, Islamic Azad University, Tehran, Iran

Corresponding Author: Reza Mir Drikvand, Assistant Professor, Department of Agronomy and Plant Breeding, Khorramabad Branch, Islamic Azad University, Khorramabad, Iran. Tel: +98-6633120025, Fax: +98-6633120026, Email: drikvand_r@yahoo.com

Received June 14, 2018; Accepted August 23, 2018; Online Published September 30, 2018

Abstract

Introduction: Quality characteristics including grain protein content, gluten, falling number, and SDS sedimentation volume are important contributors to the grain yield and quality of the wheat. To identify the markers associated with such traits, this study run in two separated experiments: under-field and in laboratory.

Materials and Methods: One hundred wheat genotypes were evaluated in an alpha lattice design with two replications. Association mapping using *Structure* and *Tassel* software was carried out using 102 SSR markers: 66 unlinked and 36 quantitative trait loci (QTL)-linked SSR markers. Correction for population structure was performed using genome-wide SSR markers so that genotypes were divided into six subpopulations.

Results: Thoroughly, 34 SSR markers linked with the above-mentioned traits were identified, twelve of them being QTL-linked markers. These markers were already mapped on the wheat chromosomes in previous studies containing known QTLs controlling kernel traits of the wheat. Our results confirmed 5, 3, 2, and 2 QTLs respectively for the grain protein, gluten, falling number, and SDS sedimentation volume which were previously tagged on the wheat chromosomes. Additionally, 3 QTLs were identified for the grain protein on the chromosomes 2A, 5A, 5D, and 7B. Whereas, 6 QTLs for gluten were detected on chromosomes 1A, 2D, 5A, 5B, 6B, and 7B; four QTLs were located on the chromosomes 2D, 5A, 5B, 5D, and 7D for falling number; and finally nine QTLs were found for SDS sedimentation volume on the chromosomes 1A, 1B, 2B, 3A, 3B, 4B, 6A, 6B, 7A, and 7B.

Conclusions: The results of this study indicated that association mapping is a useful method for detecting and complementing QTL information; thus, this information can be used for further wheat improvement based on a molecular marker.

Keywords: Association Mapping, Quality Traits, QTL, Wheat

Citation: Mir Drikvand R, Najafian G, Bihamta MR, Ebrahimi A. Mapping some seed quality traits in bread wheat (*Triticum aestivum* L.) by association mapping using SSR markers. J Appl Biotechnol Rep. 2018;5(3):92-99. doi:10.29252/jabr.05.03.02.

Introduction

Improvement of the end-use quality is one of the primary objectives of breeding for researchers working on raising the nutritional and functional quality of wheat. The processing and end-use characteristics of the grain, collectively known as quality traits, are under genetic and environmental control. Molecular genetic studies explaining this control may increase the efficiency of wheat breeding to improve the grain quality. Association mapping which is also referred to as linkage disequilibrium (LD) mapping has gained considerable popularity as an efficient genetic mapping methodology because of improved statistical approaches that increase its proficiency and reduce false positive associations.¹ Furthermore, association mapping has been used to identify trait-marker relationships in plants.^{2,3} Initially, this method was extensively used to dissect human diseases.⁴ Unlike linkage analysis where mapping populations are used to

determine correlations between phenotype and genotype, association mapping relies on unrelated individuals to create population-wide marker-phenotype associations.⁵ Linkage mapping based on the biparental populations is frequently used to dissect the genetic architecture of wheat quality traits. Several main effect QTLs and major genes have been identified for glutenin and grain hardness locus *Ha*,⁶ test weight,⁷⁻¹¹ *a*-amylase activity,^{10,12} grain protein content,^{11,13-19} sedimentation volume,^{10,20-22} and grain weight.²³ The main objective of the association mapping studies is detecting the correlations between genotypes and phenotypes in a sample of individuals based on the LD,²⁴ and it is suggested as a promising alternative strategy to linkage mapping.²⁵ There are some examples of applying association mapping via wide genome or candidate genes approaches in wheat. Breseghello and Sorrells²⁶ used association mapping and detected the main effect QTLs for the kernel weight, length, and width.

Neumann et al used 96 bread wheat accessions and detected the main effect QTLs for several agronomic and quality traits such as protein content, sedimentation volume, and 1000-kernel weight.²⁷ Jochen et al investigated the genetic basis of protein content, sedimentation volume, 1000-kernel weight, test weight, and starch content using an association mapping approach and detected the main effect QTLs for these traits.²⁸

In contrast, it was found that the test weight and sedimentation volume were only controlled by epistatic QTLs. Emebiri et al¹² used a whole genome scan with DArT markers to identify chromosomal regions influencing late maturity α -amylase (LMA) in synthetic hexaploid wheat. They found significant markers at the chromosome 7B, a region previously linked to LMA in bread wheat, but not at the chromosome 3B region, they concluded that a region on chromosome 6B has potentially great interest for this trait and have a significant association with LMA phenotypes in the wheat accessions. Abdollahi Mandoulakani et al²⁹ investigated associations between the ISSR, IRAP, REMAP markers and the agronomic traits of wheat. They found that 94 loci were significantly associated with agronomic traits. Shahzad et al experimented the grain quality traits, genetic diversity, and marker-trait association in a range of wheat species.³⁰ In their study, 8 QTLs were found for 5 traits including protein, gluten contents, a test weight of bread, and chapati making quality. Protein content, test weight, bread quality, and Glu-B1 were found significantly associated respectively with primers WMC419 (32 cM), WMC128 (30 cM), WMC419 (32 cM), WMC818 (17 cM), and WMC416 (44 cM). Kumari et al also identified quantitative trait loci (QTL) regulating grain traits in wheat.³¹ They found 18 QTLs distributed on 8 chromosomes for 7 grain traits of bread wheat. Karolina et al confirmed the predominant effect of the Glu-D1d allele on the technological properties of wheat grains.³² In a study conducted by Kaur et al it was indicated that micro-sedimentation test values are not much affected by the absence of *Glu-B3/Gli-B1*, and hence, the lines having better root traits with no *Glu-B3/Gli-B1* and secalin could be used for improving the bread quality and yield in wheat.³³ Our study aimed to evaluate the population structure of 92 bread wheat accessions using the association mapping method to detect SSR markers linked to the loci involved in quality characteristics of the bread wheat.

Materials and Methods

Plant Material and Field Experiment

A collection of 92 genotypes of bread wheat (*Triticum aestivum*) and 8 durum wheat (*T. durum*) (only used in field experiment) were used in this study (Table 1). These genotypes were cultivated in different regions of Iran and widely used in wheat production as well. This population consisted of local and modern cultivars as well as promising lines. The experiment was alpha lattice designed with 2 replications for 100 entries. The 92 bread wheat genotypes used for association mapping were evaluated according to AACC approval methods 39-25, 38-12, 56-81, and 56-60³⁴ for grain protein, gluten, falling number, and SDS sedimentation

Table 1. Information on Wheat Genotypes Used in This Study

No.	Name/Identity	Growth Habit
1	Karaj-1	F
2	Karaj-2	F
3	Karaj-3	W
4	Azadi	S
5	Ghods	S
6	Mahdavi	F
7	Niknejad	S
8	Marvdasht	S
9	Pishtaz	S
10	Shiraz	S
11	Sepahan	S
12	Bahar	S
13	Parsi	S
14	Sivand	S
15	M-85-7	S
16	WS-82-9	S
17	Sirvan	S
18	DN-11	S
19	Bezostaya	W
20	Navid	F/W
21	Alamout	F/W
22	Alvand	F
23	Zarin	F
24	MV-17	W
25	Gaspard	W
26	Gascogne	W
27	Soisson	W
28	Shahriar	W
29	Tous	W
30	Pishgam	F
31	Mihan	W
32	Oroom	F
33	Zaree	W
34	Inia	S
35	Khazar-1	S
36	Mughan-1	S
37	Mughan-2	S
38	Mughan-3	S
39	Golestan	S
40	Alborz	S
41	Kaveh	F
42	Rassoul	S
43	Tajan	S
44	Shiroudi	S
45	Darya	S
46	Arta	S
47	Morvarid	S
48	Gonbad	S
49	Arvand	S
50	Chenab	S
51	Bayat	S
52	Falat	S
53	Heirmand	S
54	Darab-2	S
55	Atrak	S
56	Chamran	S
57	Star	S
58	Dez	S
59	Vee/Nac	S
60	Line A	S
61	Aflak	S

Table 1. Continued

No.	Name/Identity	Growth Habit
62	Baaz	S
63	Shahpasand	W
64	Omid	W
65	Roshan	F/S
66	Tabassi	F
67	Sholleh	S
68	Sorkhtokhm	S
69	Adl	F
70	Sardari	W
71	Azar-2	W
72	Zagross	S
73	Sabalan	W
74	Sp.Bc of Roshan	S
75	Wi. Bc of Roshan	W
76	Cross of Shahi	W
77	Maroon	S
78	Kavir	S
79	Hamoon	S
80	Bam	S
81	Akbari	S
82	Sistan	S
83	Arg	S
84	UN-11	W
85	Kohdasht	S
86	Ohadi	W
87	Rijav	F
88	Rasad	W
89	Karim	S
90	Ch	W
91	Homa	W
92	Norstar	W
93	Yavarous	S
94	Dehdasht	S
95	Karkheh	S
96	Aria	S
97	Dena	S
98	Behrang	S
99	Seimareh	S
100	Saji	F

Numbers of 93-100 are durum wheat.

S, W, and F: Spring, winter and facultative growth type.

volume, respectively.

DNA Extraction and Marker Assay

Genomic DNA was extracted from 100 mg fresh frozen leaves of individual plants for all genotypes grown in the plastic pot in greenhouse taking a modified CTAB method.³⁵ DNA quality was checked by electrophoresis on 0.8% agarose gel and DNA concentration was determined by a Pico Drop (Pico200). Sixty-six unlinked SSR markers were selected and synthesized according to the information available in the Grain Genes database (<http://wheat.pw.usda.gov/GG2>). These markers were randomly distributed across the wheat genome. Furthermore, 36 mapped QTLs linked markers from previous studies were selected. Map positions of some of these markers were based on the linkage map published by Somers et al.³⁶

Polymerase chain reactions were performed in a Thermal Cycler (Bio-Rad Model thermal cycler) in a volume of 15 μ L containing: 3 μ L of DNA template (50 ng/mL) and 12 μ L of the master mix containing 7.8 μ L of ddH₂O, 1.5 μ L of 10x PCR buffer, 0.3 μ L of 100 mM MgCl₂, 0.3 μ L of 10 mM dNTPs, 0.5 μ L of each forward and reverse primers (1 pmol/mL), and 0.1 μ L of Taq polymerase (500 U/mL). The amplification steps were as follows: 1 cycle at 94°C for 4 minutes, then 35 cycles comprising 94°C for 1 minute, annealing of primer at 50-60°C (depending on the primer) for 1 minute and then extension at 72°C for 1 minute. The final extension was carried out at 72°C for 10 minutes. The amplification products were electrophoresed on 3.5% agarose gels (50% Metaphor and 50% LE Agarose), and for staining, 3 μ L Gel Red and dye (1:1 ratio) was added to each sample. Gel scanning was performed using Bio-Rad Gel Doc.

Data Analysis and Association Mapping

Analysis of variance (ANOVA) for quality traits was carried out using ALPHAGEN software version 1.1.³⁷ Two sets of SSR markers were used for association analysis. First, 66 SSR primers were used for structure analysis in the 92 bread wheat genotypes. These data were also used for a genome-wide approach to identify markers linked to seed quality traits. A second set of these 36 SSR QTLs-linked markers on wheat were tested for targeted association mapping of seed quality traits. For determining the population structure and K values, genotypic data was processed by the software program STRUCTURE 2.3.³⁸ Applying a burn-in of 100 000 iterations, followed by 100 000 iterations,³⁵ K=1-15 and 5 runs per K was tested for targeted association mapping of seed quality traits. The fundamental basis of such clustering methods is allocating every individual genotype to K clusters in such a way that both Hardy-Weinberg equilibrium and linkage equilibrium are valid within clusters, whereas these kinds of equilibrium are missing between clusters. To obtain an association between markers and traits, Q-matrix, quality traits matrix, and scored SSR markers matrix were tested using the mixed linear model (MLM) method of Pritchard et al.³⁸ where this method is accomplished in the software package TASSEL 2.1 (<http://www.maizegenetics.net/>). To obtain the permutation-based test of marker significance and the experiment-wise P values for marker significance, the number of permutations was set at 1000 in this software. Only markers with an allele frequency of 5% or higher were included in the association mapping analysis.

Results

Analysis of Variance and Structure Analysis

Analysis of variance showed a significant difference in all quality traits (Table 2). These results indicates that genetic variation exists among genotypes. The Population structure analysis was conducted using genotypic data of 102 SSR markers. To determine the number of subpopulations based on the suggestion of Pritchard and Wen,³⁹ we set K from 1 to 15. The population structure matrix (Q) was defined by the running structure of K=6 where the highest likelihood

Table 2. Analysis of Variance for Seed Quality Traits

Source of Variation	df	Mean of Square			
		Grain Protein	Gluten	Falling Number	SDS Sedimentation
Replication	1	4.11	744.98	275356.10	5.44
Block (adj)	18	0.046	18.49	8281.92	2.97
Treatment	99	0.41	15.18	9898.16	39.09
Treatment (adj)	99	0.25**	7.71*	8407.60*	35.68**
Residual	81	0.047	4.74	6236.85	3.01
Total	199				

Note: * and ** significant at 0.05 and 0.01 probability level, respectively.

has been obtained. The standard deviation of this group was lower than other groups (Table 3). K is the number of subpopulations consisted of loci in Hardy–Weinberg and linkage equilibrium. The accessions were subdivided into 6 subpopulations (Figure 1). In Figure 1, the majority of spring growth type genotypes were categorized into 3 subgroups (red, yellow, and aqua). Some of the winter growing genotypes were allocated to 2 subgroups (green and fuchsia) and facultative growing genotypes were classified in blue subgroups. Q-matrix outputs of 6 subpopulations were run (K=6) for the structure based association analysis.

Marker-Trait Associations

Association analysis was conducted based on an MLM method.³⁸ Association analysis was used for determining the SSR markers associated with the quality-related traits in the structured bread wheat population based on the population structure (Q-matrix). The association with SSR markers for the studied traits is described in table 4. The results of this study showed that among 36 QTLs derived primers, 29 SSR primers were polymorphic. These primers amplified 58 polymorphic allele markers, ranging from 1 (Xgwm639) to 4 (Xcfd13) with

a mean of 2 alleles per locus. Of the total 34 allele markers linked to 4 quality wheat traits, 8, 9, 6, and 11 of them were related to grain protein content, gluten, falling number, and SDS sedimentation volume, respectively. Twenty-two of the 258 allele markers from the genome-wide SSR markers were found to exhibit a significant ($P < 0.01$) association with the above-mentioned 4 quality traits along with twelve of the 72 allele markers amplified by QTL-derived SSR primers. Allelic data onto all SSR markers with the significant association is presented in Table 4.

Discussion

Association mapping can identify QTLs by examining the marker-trait associations which can be attributed to the strength of LD between markers and functional polymorphisms across a set of diverse germplasm.⁴⁰ Seed quality traits of bread wheat, specifically protein content, gluten, falling number, and SDS sedimentation volume are among the main objectives of a bread wheat breeding program and are effective in grain quality of bread wheat. These traits strongly influence the end use wheat and its nutritional and market value. Marker-assisted selection (MAS) will

Table 3. Average Logarithm of the Probability of Data Likelihoods (Ln P(D)) of 92 Bread Wheat Genotypes

K	Average Ln P(D)	SD	K	Average Ln P(D)	SD	K	Average Ln P(D)	SD
1	-5084.95	7.16	6	-4506.95	21.26	11	-4845.3	23.95
2	-4877.4	11.55	7	-4554.85	25.67	12	-4782.1	38.20
3	-4771.35	14.80	8	-4603.2	27.54	13	-4855.6	40.52
4	-4685.15	17.14	9	-4604.4	30.88	14	-4824.4	39.63
5	-4527.45	19.54	10	4650.9	33.12	15	-4901.1	41.23

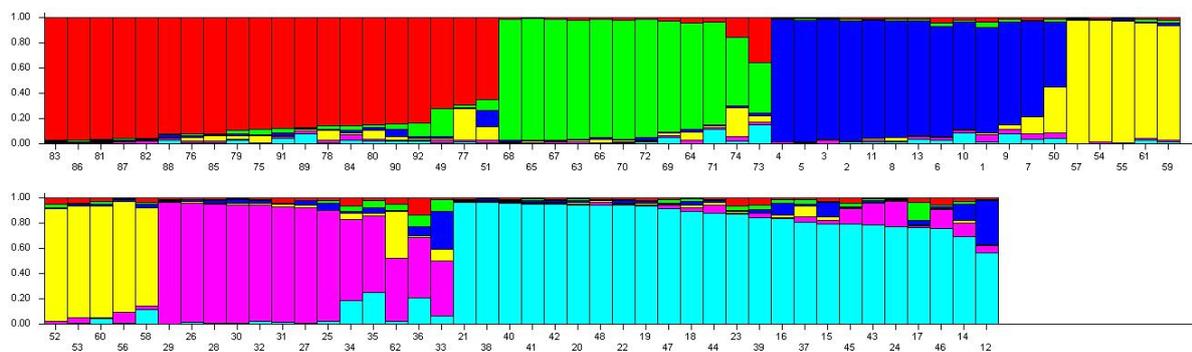
**Figure 1.** Diagram Derived From the Program Structure 2.3 Showing the Distribution of Bread Wheat Genotypes Into 6 Subpopulations (K=6).

Table 4. Association of SSR Markers With Traits

Trait	No.	Marker	Chromosome	P Value	Reference	
Grain protein	Markers associated with this trait based on the previous study (QTL-linked markers)		Xcfd13	6B, D	*	6
	2	Xbarc54	3A, 6D	**	9	
	3	Xbarc86	3A	**	41	
	4	Xbarc320	5D	**	41	
	5	Xgwm577	7B	**	18	
	Related to other traits or used for structure analysis associated with this trait		Xcfa2141	5A, D	**	
	2	Xgwm121	5D, 7B	*		
	3	Xgwm515	2A, D	**		
	Gluten	Markers associated with this trait (based on the previous study)		Xcfa2153	1A	*
2		Xcfd18	5D	**	6	
3		Xbarc200	2B	*	6	
Related to other traits or used for structure analysis associated with this trait		Xbarc74	5B	**		
2		Xbarc330	5A	**		
3		Xgwm88	6B	**		
4		Xgwm135	1A	**		
5		Xgwm539	2D	*		
6		Xgwm577	7B	**		
Falling number	Markers associated with this trait (based on the previous study)		Xbarc80	1B	*	10
	2	Xgwm113	4D	*	10	
	Related to other traits or used for structure analysis associated with this trait		Xcfd40	5A, D	*	
	2	Xbarc168	2D	**		
	3	Xgwm295	7D	**		
SDS sedimentation volume	Markers associated with this trait (based on the previous study)		Xgwm371	5B, D	*	42
	2	Xwmc453	2A, B, D	*	9	
	Related to other traits or used for structure analysis associated with this trait		Xbarc86	3A	**	
	2	Xbarc146	6A, B, D	*		
	3	Xgwm11	1BS – 1BL	**		
	4	Xgwm33	1A, B, D	**		
	5	Xgwm88	6B	**		
	6	Xgwm131	1, 3, 7B	*		
	7	Xgwm369	3A, 4B	*		
8	Xwmc317	2BL	**			
9	Xwmc596	7A	**			

** and * significant at 5% and 1% levels of probability, respectively.

enhance the efficiency of the breeding process. Moreover, the accomplishment of MAS allows the selection of individuals carrying the suitable alleles at the target loci. The marker-trait associations revealed for all 4 traits QTL distributed throughout the genome.

In previous studies, 18 markers that linked with protein content were used. In this study, we identified only 5 markers including Xcfd13 marker on chromosomes 6B and 6D, Xbarc54 on chromosomes 3A and 6D, Xbarc86 on chromosome 3A, Xbarc320 on chromosome 5D, and finally Xgwm577 on chromosome 7B which were shown to be associated (Table 4). This result confirmed the QTL locations that were identified in some previous studies.^{9,18,41} Tadesse et al reported that 2 DArT markers on 5B were highly associated with protein content and alveograph strength.¹⁹ In microsatellite consensus map, some of these SSR markers have been mapped as Xgwm577 in the distance 137 cM on the short arm of 7B, Xcfd13 in the distance 17 cM on the short

arm 6B and 21 cM on the long arm of 6D, and Xbarc54 on the distance 47 cM on the short arm 6D.³⁶

Additionally, Xcfa2141 on chromosome 5A, 5D, Xgwm121 and Xgwm515 on chromosome 5D, 7B, 2A, and 2D, were linked to grain protein content. These markers were used for population structure. It is possible which indicate a systematic type I error and false positive.⁴³ Jochen et al, using the association mapping in winter wheat cultivars, studied QTLs linked to the protein quality-related traits and detected 4 QTLs associated with this trait located on the chromosomes 3A, 1B, 5D, and 2D.²⁸ Furthermore, an experiment was carried out in different environmental conditions and identified QTLs placed on the chromosome 7A.⁴⁴ Using recombinant inbred lines, Blanco et al identified 3 QTLs on chromosomes 6AS, 2AS, and 7BL that controlled this trait.⁴⁵ Joppa et al reported that 66% of the variation of QTLs that control protein content was related to chromosome 6B.⁴⁶ These loci located on the short arm of chromosome 6B near the centromere. As well

as Joppa et al, Chee et al reported that QTLs for the protein quality were on the short arm of chromosome 6B.^{46,47} It can be concluded that chromosome 6B has an important role in the genetic control of this trait.

Glutenin and gliadins are important quality traits in wheat. Nine QTLs were identified for gluten on chromosomes 5D, 2B, 5A, 7B, 2D, 5B, 1A, and 6B. In a previous study, Xcfd18, Xbarc200, and Xcfa2153 markers were known as associated QTLs with this trait located on chromosomes 5D, 2B and 1A, respectively.⁶ The results of the present study accorded to the results of Zhang et al study.⁶ Somers et al mapped Xbarc200 marker at a distance of 37 cM on the short arm of chromosome 2B.³⁶ In another study, it was found that the amounts of gluten are controlled by 2 QTLs that located on chromosomes 5B and 7A.⁴⁸ The genetic control of glutenin and gliadin is relatively well known in wheat.^{28,49} It can be concluded that association mapping can complement previous QTL information and provide opportunities for further wheat improvement programs.

Late maturity α -amylase is a genetic defect in wheat which results in the production of α -amylase, shown as substandard falling numbers, in the absence of pre-harvest rain and under cool temperatures during ripening.¹² Wheat seeds with high α -amylase activity have little economic value because their handling and storage are difficult.^{50,51} Previous investigations had identified 5 SSR markers with a significant association with falling number. In the present study, these markers were tested for targeted association mapping. The result of the present study indicated that Xgwm80 and Xbarc113 markers as QTLs on chromosomes 1B and 4D were significantly associated with this trait (Table 4). This result was also confirmed by another researcher finding.¹⁰ In the Somers wheat consensus map, Xbarc80 marker was located on long arm of chromosome 1B at a distance of 106 cM.³⁶ The present study confirmed a significant correlation between falling number and the markers located on chromosome 6B. Through using association mapping to identify the exact location of α -amylase genes in hexaploid wheat, a significant correlation between these traits and markers located on chromosome 7B was observed.¹²

Furthermore, 4 SSR markers used for population structure assay displayed to be associated with falling number and located on chromosomes 5A, 5B, 5D, 7D, and 2D. These results showed that possibly this association may be false positives. Although, false positives can also arise from situations where the statistical test is valid and the association exists, but there is an association with population structure instead of the trait of interest.⁵² This matter is recommended to be examined in future studies.

Five SSR markers that in the previous studies were shown to be linked to SDS sedimentation were selected for association analysis. Among them, Xwmc453⁹ and Xgwm371⁴² markers were found to exhibit a significant association with SDS sedimentation. These markers were located on the chromosomes 2A, 2B, 2D, 5B, and 5D. Xwmc453 marker was mapped on the short arm of chromosome 2D at a distance

of 43 cM.³⁶ Furthermore, Xbarc86 marker was associated with SDS sedimentation and protein content. This marker has a pleiotropic effect. Nine SSR markers used for other quality traits or population structure analysis were associated significantly with SDS sedimentation. Using QTL mapping, Blanco et al also found QTLs that located on chromosome 3AS, 3BL, 5AL, 6AL, and 7BS linked with this trait.⁴⁰ Huang et al reported 3 QTLs on 1B, 2D, and 5D chromosomes.⁹ In another study using association mapping analysis in bread wheat, QTLs on chromosome 2D, 3A, 5D, and 1A were identified for SDS sedimentation.²⁸ These results are in agreement with the results of the present study. Results of this study and previous investigation confirmed that 2D and 5D chromosomes had a more significant role in controlling this trait.

Conclusions

In the present study, we conclude that association mapping in bread wheat is not only suitable but can also reveal additional QTLs not found in bi-parental populations, because the genetic variation within an association mapping panel is usually much greater than that in a conventional linkage mapping populations.

Authors' Contributions

RMD and GN have made contributions towards the design, execution, and field and laboratory data collection. MRB and AE have helped to data analysis.

Conflict of Interest Disclosures

The authors declare they have no conflicts of interest.

Acknowledgments

Authors thank Elham and Aram salahvarzi, Ziba Fuladvand, and Abbas Rezaeizad for technical assistance.

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