

# Identification of Quantitative Trait Loci (QTL) Underlying Protein, Oil, and Five Major Fatty Acids' Contents in Soybean<sup>\*</sup>

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# ABSTRACT

Improved seed composition in soybean [*Glycine max* (L.) Merr.] for protein and oil quality is one of the major goals of soybean breeders. A group of genes that act as quantitative traits with their effects can alter protein, oil, palmitic, stearic, oleic, linoleic, and linolenic acids percentage in soybean seeds. The objective of this study was to identify Quantitative Trait Loci (QTL) controlling protein, oil, and fatty acids content in a set of  $F_{5:8}$  RILs derived from a cross between lines, 'MD 96-5722' and 'Spencer' using 5376 Single Nucleotide Polymorphism (SNP) markers from the Illumina Infinium SoySNP6K BeadChip array. QTL analysis used WinQTL Cart 2.5 software for composite interval mapping (CIM). Identified, were; one protein content QTL on linkage group (LG-) B2 or chromosome (Chr\_) 14; 11 QTL associated with oil content on six linkage groups LG-N (Chr\_3), LG-A1 (Chr\_5), LG-K (Chr\_9), LG-F (Chr\_13), LG-B2 (Chr\_14), and LG-J (Chr\_16); and sixteen QTL for five major fatty acids (palmitic, stearic, oleic, linoleic, and linolenic acids) on LG-N (Chr\_3), LG-F (Chr\_14), LG-E (Chr\_15), LG-J (Chr\_16), and LG-G (Chr\_18). The SNP markers closely linked to the QTL reported here will be useful for development of cultivars with altered oil and fatty acid compositions in soybean breeding programs.

#### **KEYWORDS**

Soybean; SNP Linkage Map; QTL; RIL; Oil; Major Fatty Acids; MD96-5722; Spencer

#### **1. Introduction**

Soybean (*Glycine max* L. Merr.) is one of the major economic crops in the world for the source of edible oil and feeds. Traditionally, protein and oil are the primary seed quality traits of interest for soybean but recently there is increased demand for altered oil components *i.e.*, fatty acids for biofuel and human consumption. The range of protein and oil content in modern elite soybean cultivars are 34.9% - 39.6% and 19.0% - 23.5% respec-

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tively [1,2]. The oil quality depends on its fatty acid composition that affects nutritional value, flavor and stability of the soybean oil. The term "total fatty acid content" refers to the sum of the five major fatty acid components found in soybeans, namely palmitic (C16:0), stearic (C18:0), oleic (C18:1), linoleic (C18:2) and linolenic acids (C18:3) [3]. The human body can synthesize palmitic, stearic and oleic acids through metabolism. Low percentage of palmitic acid in soybean oil is desirable for edible oils which may be able to reduce the risk of coronary disease [4,5]. A diet with high oleic acid, like olive oil, has reduced cholesterol that can affect positively arteriosclerosis and heart disease [6]. Another use

<sup>\*</sup>Mention of trade names or commercial products in this publication is solely for the purpose of providing specific information and does not imply recommendation or endorsement by the US Department of Agriculture.

for modified soybean oils is the production of biodiesel fuel which has emerged as a potential renewable energy source to help alleviate environmental concerns. A high percentage of oleic acid is desirable for biodiesel to enhance biodiesel's oxidative stability [7]. However, a high percentage of linolenic and linoleic acids are desirable to increase the energy content of biodiesel and decrease the gelling temperature. Human can't synthesize linoleic and linolenic acids and these two essential fatty acids that humans have to obtain from food. Linolenic acid is also essential in photosynthesis and pollen development in plants, thus it cannot be eliminated from the seed oil [3]. Rancidity and short shelf life in soybean oil are due to linolenic acid because it can easily be oxidized at the three double bonds [3]. Separate breeding efforts have been initiated to alter the fatty acid profile of soybean oil for human consumption with high oleic acid and low palmitic and linolenic acids and for biodiesel with the reverse profile [5].

Protein and oil contents are polygenic quantitative traits resulted from interactions between multiple genes and the environment [8]. Gelderman (1975) [9] first referred such polygenes by an acronym Quantitative Trait Loci (QTL), a region of genome that associated with an effect on a quantitative trait. Abundance molecular markers are necessary to cover the whole genome of soybean which could identify significant QTL and candidate genes for quality traits of soybean seeds. Currently, Soy Base (2013) [10] contains more than 250 QTL for each of seed protein and oil, all of which have been mapped in many different populations and environments. Recently, we identified two QTL for protein and six QTL for oil in the recombinant inbred lines (RIL) of PI 438489B and "Hamilton" [11]. SoyBase (2013) [10]also contains more than 245 OTL for fatty acid components viz. palmitic, stearic, oleic, linoleic, and linolenic acids mapped in many different populations and environments.

Different types of molecular markers have been used to construct linkage maps and identify QTL in soybean such as single nucleotide polymorphism (SNP), restriction fragment length polymorphisms (RFLP), simple sequence repeat (SSR), amplified fragment length polymorphism (AFLP), and random amplified polymorphic DNA (RAPD) [11-19]. Here the Genetic Linkage Map of Soybean from SNP markers genotyped through Illumina Infinium BeadChip Array was used. The objective of this study was to identify QTL associated with protein, oil and five major fatty acids in theMD96-5722 by 'Spencer' recombinant inbred lines (RILs) population.

#### 2. Materials and Methods

### 2.1. Plant Material and Seed Analysis for Protein, Oil, and Fatty Acids

Ninety-two F<sub>5:7</sub> RILs developed by crossing breeding

line, MD96-5722, with cultivar 'Spencer', was used to generate phenotypic and genotypic data. The population was grown in a field at Favetteville State University(FSU) campus, Fayetteville, NC in 2012 with row spaces of 25 cm generating a plant density of 160,000 plants/ha. No additional fertilizers or insecticides were used. The experiment was conducted from May 1<sup>st</sup> to October 4<sup>th</sup>, 2012. Seeds at harvest maturity stage were analyzed for protein, oil, and fatty acids. About 25 g of seed from each line was ground using a Laboratory Mill 3600 (Perten, Springfield, IL), the ground samples were analyzed by near infrared reflectance using a diode array feed analyzer AD 7200 (Perten, Springfield, IL) [20-22]. Perten's Thermo Galactic Grams PLS IO software, initially developed by the University of Minnesota was used for calibrations. Protein and oil analyses were based on a seed dry matter basis, and fatty acids were analyzed based on total oil [21,23].

## 2.2. Genetic Map and QTL Identification

The 'MD 96-5722' by 'Spencer' population was genotyped using 5,376 SNPs through SoySNP6K Illumina Infinium BeadChip array. A genetic linkage map [24] was constructed through Join Map 4 (Kyazma BV, Wageningen, Netherlands) [25]. Composite interval mapping (CIM) was used to detect QTL from genotypic and phenotypic data using WinQTLCart2.5 software

(http://statgen.ncsu.edu/qtlcart/WQTLCart.htm) [26]. The Model 6 with four parameters for forward and backward stepwise regression, 10 cM window size, 1 cM step size and five (5) control markers were chosen for running WinQTLCart [26]. The threshold was determined by permutations tests with 1000 iterations.

#### **3. Results**

**Table 1** shows approximately normal distribution of protein, oil and the 5 major fatty acid compositions in the  $F_{5:7}$  seeds. Both the skewness and kurtosis values for these traits were <1.00. Variations among RIL lines were narrow for protein (CV = 3.57%) and oil (4.74%) but was wider for fatty acids components. For example, variation for oleic acid was 12.77% and for linolenic acid was 15.88%.

Composite Interval Mapping (CIM) was used to identify candidate QTL. Names of QTL against each trait, linkage group (LG)/chromosome (Chr\_), positions of the QTL with markers (SNP) interval, LOD score, percentage of r<sup>2</sup> and additive values presented in **Table 2**. **Figure 1** also presented positions of QTL on each linkage group. Eight linkage groups namely, LG-N (Chr\_3), LG-A1 (Chr\_5), LG-K (Chr\_9), LG-F (Chr\_13), LG-B2 (Chr\_14), LG-E (Chr\_15), LG-J (Chr\_16), and LG-G (Chr\_18) contained 28 QTL for protein, oil and the five

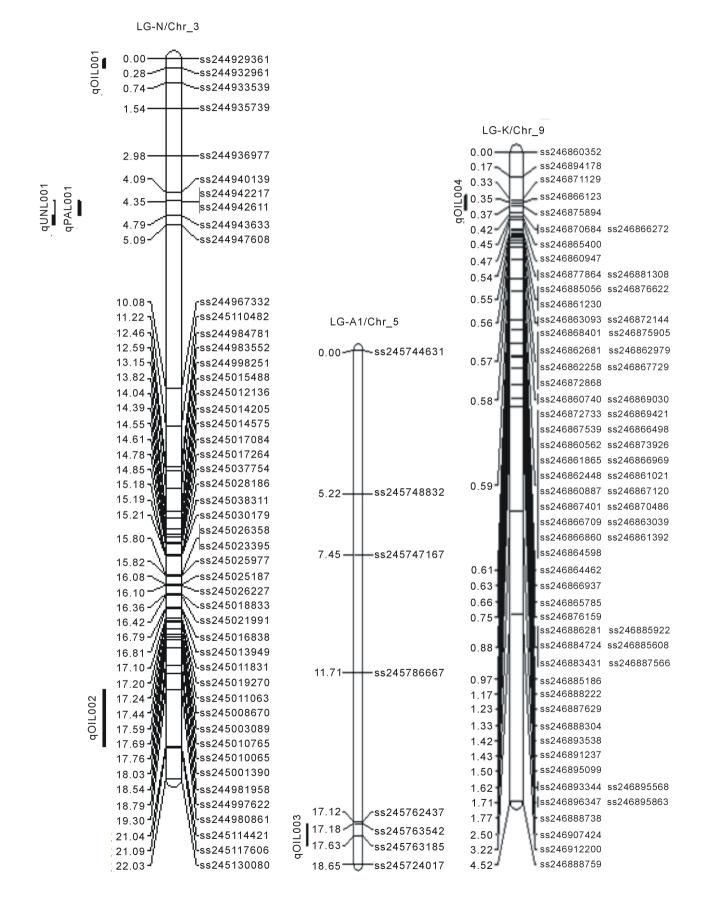
Traits	Mean ± SD (%)			RIL's	RIL'sCV (%)	Frequency distribution of all populations	
	Maryland	"Spencer"	RIL ( $F_{5:8}$ ) population	Range (%)		Skewness	Kurtosis
Protein	$47.8\pm0.27$	$45.50\pm0.11$	$42.28 \pm 1.51$	45.81 - 38.40	3.57	0.17	0.04
Oil	$18.8\pm0.44$	$19.30\pm0.19$	$19.78\pm0.93$	22.82 - 17.23	4.74	0.24	1.14
Palmitic	$10.60\pm0.71$	$12.33\pm0.10$	$10.14\pm0.86$	12.33 - 8.31	8.45	0.16	-0.15
Stearic	$3.7\pm0.08$	$3.50\pm0.03$	$3.56\pm0.19$	4.12 - 3.11	5.36	0.19	0.44
Oleic	$24.10 \pm 1.67$	$18.35\pm0.28$	$20.39\pm2.60$	28.00 - 15.1	12.77	0.62	0.77
Linoleic	$55.6\pm0.72$	$52.58 \pm 0.68$	$59.00 \pm 1.72$	62.63 - 52.82	2.92	-0.75	1.26
Linolenic	$6.3\pm0.31$	$12.98\pm0.15$	$8.84 \pm 1.40$	13.00 - 5.61	15.82	-0.21	0.14

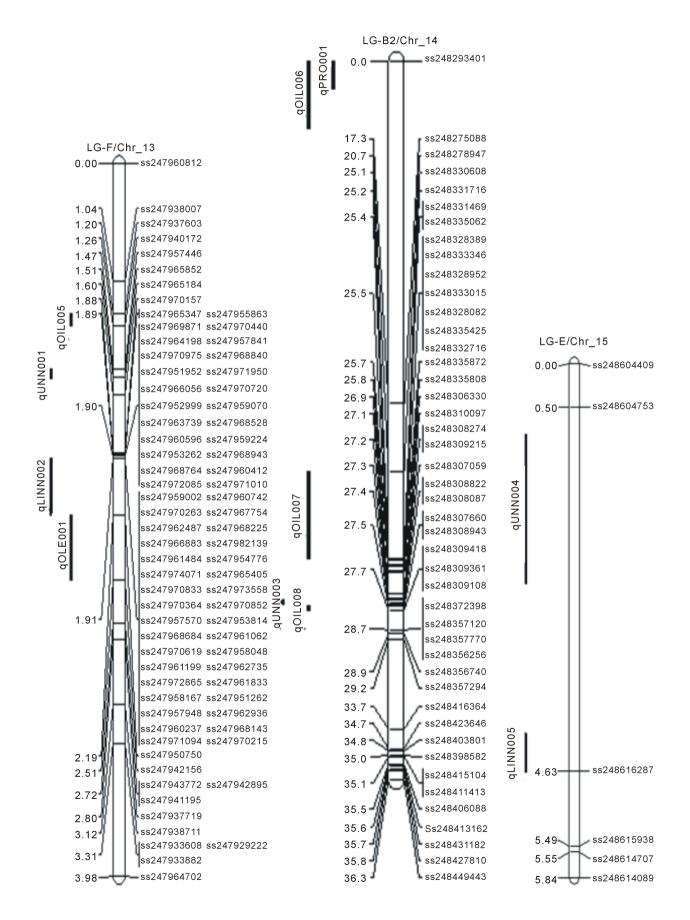
Table 1. Means and ranges of protein, oil, palmitic, stearic, oleic, linoleic and linolenic acid contents (% on dry based) of soybean cultivar, MD96-5722, 'Spencer' and their  $F_{5:7}$  RIL population.

 Table 2. Chromosomal locations and parameters associated with the quantitative trait loci (QTL) of protein, oil and major fatty acid components in MD 96-5722 and 'Spencer' Recombinant Inbred Line populations of soybean.

Trait	Trait QTL		<sup>†</sup> Peak position(cM)	<sup>‡</sup> 2-LOD support interval (cM)	Markers interval	<sup>§</sup> Peak LOD	${}^{\#}R^{2}\left( ^{6}\!$	<sup>††</sup> Additive effects
Protein	<i>qPRO</i> 001	B2/14	0.00	0.00 - 1.40	ss248293401-ss248275088	4.13	0.07	0.38
Oil	qOIL001	N/3	0.80	0.00 - 2.20	ss244929361-ss244932961	2.66	0.47	0.34
Oil	qOIL002	N/3	20.30	19.2 - 20.7	ss244980861-ss245114421	2.97	0.97	0.16
Oil	q01L003	A1/5	17.60	17.2 - 17.6	ss245763524-ss245763185	2.75	0.1	0.12
Oil	qOIL004	K/9	0.40	0.30 - 0.40	ss246875694-ss246860974	2.69	0.99	0.04
Oil	qOIL005	F 13	1.20	1.99 - 1.26	ss247937603-ss247940172	3.34	0.12	0.24
Oil	qOIL006	B2/14	0.00	0.00 - 3.40	ss248293401-ss248275088	2.72	1.12	0.11
Oil	qOIL007	B2/14	24.70	24.50 - 25.00	ss248278947-ss248330608	2.51	1.16	0.12
Oil	qOIL008	B2/14	27.70	27.49 - 28.10	ss248308943-ss248309108	3.40	1.16	0.12
Oil	qOIL009	J/16	23.00	22.96 - 23.03	ss248981433-ss248982430	2.69	0.51	0.38
Oil	q01L010	J/16	25.60	23.04 - 26.00	ss248982430-ss248982430	3.81	0.74	0.32
Oil	qOIL011	J/16	28.90	28.70 - 30.30	ss248982430-ss249037210	4.67	0.72	0.41
Palmitic	qPAL001	N/3	4.80	4.34 - 5.00	ss24494261-ss244947608	3.21	0.54	0.35
Palmitic	qPAL002	G/18	2.00	1.80 - 2.02	ss249629157-ss249621644	4.80	0.62	0.98
Stearic	qSTEL001	J/16	21.60	20.50 - 21.90	ss248977568-ss248979552	3.67	0.23	0.01
Oleic	qOLE001	F/13	2.29	2.18 - 2.50	ss247950750-ss247942156	3.56	0.08	0.49
Oleic	qOLE002	J/16	23.00	22.96 - 24.00	ss248981433-ss248993887	3.60	0.17	0.93
Oleic	qOLE003	J/16	29.80	29.79 - 29.90	ss249037210-ss249039670	3.39	0.32	0.96
Linoleic	qLINL001	N/3	4.80	4.34 - 4.90	ss24494261-ss244947608	2.57	0.62	0.49
Linoleic	qLINL002	J/16	20.6	20.4 - 21.6	ss248977568-ss248979552	3.01	0.61	0.19
Linoleic	qLINL003	J/16	23.1	22.90 - 24.30	ss248981433-ss248993887	3.51	0.61	0.48
Linolenic	qLINN001	F/13	1.50	1.46 - 1.52	ss247957446-ss247965852	3.81	0.10	0.55
Linolenic	qLINN002	F/13	2.07	1.90 - 2.20	ss247970215-ss247950750	3.81	0.11	0.41
Linolenic	qLINN003	B2/14	27.20	27.19 - 27.39	ss248308274-ss248308822	29.7	0.07	0.25
Linolenic	qLINN004	E/15	1.50	0.80 - 2.50	ss248604753-ss248616287	2.58	0.05	0.44
Linolenic	qLINN005	E/15	4.50	3.30 - 5.50	ss248604753-ss248616287	4.62	0.05	0.44
Linolenic	qLINN006	J/16	23.00	22.30 - 23.00	ss248980834-ss248981847	2.74	0.23	0.82
Linolenic	qLINN007	J/16	29.8	28.70 - 29.9	ss249010538-ss249039670	3.02	0.23	0.44

<sup>†</sup>Position of peak LOD value on composite maps described previously [46]; <sup>‡</sup>The positions that define the two LOD intervals around the position of peak likelihood for the QTL; <sup>§</sup>The log of odds (LOD) value at the position of peak likelihood of the QTL; <sup>#</sup>R<sup>2</sup> estimates the proportion of RIL mean variance (%) explained by the detected QTL; <sup>††</sup>A positive number in additive effect of the QTL indicates that eallele for susceptibility was derived from the line indicated and a negative number means that the allele for resistance was derived from the line indicated.





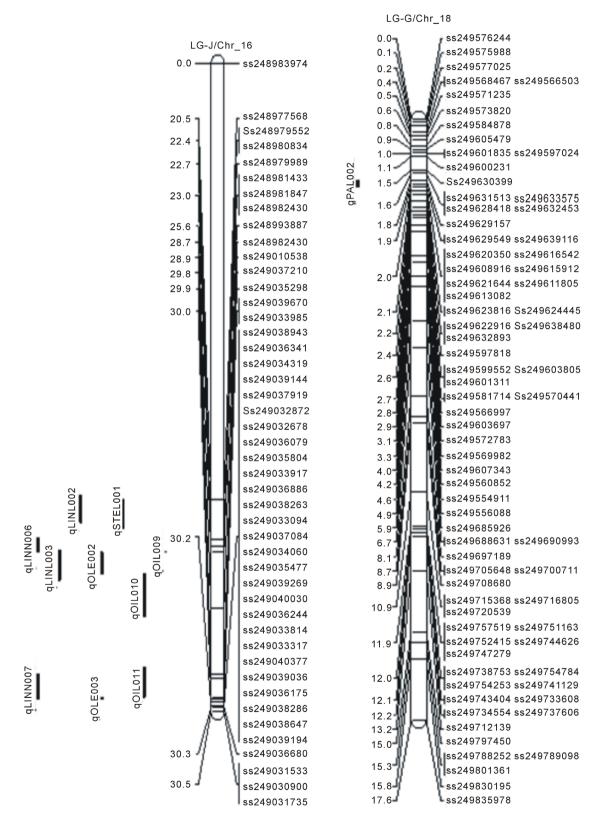


Figure 1. Locations of SNP markers and the QTL that underlie soybean seed protein (qPRO---), oil (qOIL---), palmitic (qPAL---), stearic (qSTEL---), Oleic (qOLE---), Linoleic (qLINL---) and Linolenic(qLINN---) acid contents (% on dry based) in the MD 96-5277 by 'Spencer' RIL populations. Chr./LGs were drawn using MapChart according to the MD 96-5277 by 'Spencer' genetic linkage map [24,47].

major fatty acids component. No QTL was found on the other 12 linkage groups of soybean.

One significant QTL for protein (*qPro*001) was identified on LG-B2 (Chr\_14) with LOD scores 4.13. Eleven QTL (*qOil*001 to *qOil*011) for oil contents were identified. Within these QTL, two were on LG-N (Chr\_3); one of each was on LG-A1 (Chr\_5), LG-K (Chr\_9), and LG F (Chr\_13). Among the rest six, three QTL was identified on each LG-B2 (Chr\_14) and LG-J (Chr\_16). The LOD scores for QTL of oil ranged between 2.51to 4.67.

There were total of 16 QTL for fatty acids identified; two for palmitic acid (*qPal*001 on LG-N/Chr\_3 and *qPal*002 on LG-G/Chr\_18), one for stearic (*qSte*001 on LG-J/Chr\_16), three for oleic (*qOle*001 on LG-F /Chr\_13; *qOle*002 and *qOle*003 on LG-J/Chr\_16), three for linoleic (*qLinl*001 on LG-N/Chr\_3; *qLinl*002 and *qLinl*003 on LG-J/Chr\_16), and seven for linolenic acid (*qLinn*001 and *qLinn*002 on LG-F/Chr\_13; *qLinn*003 on LG-B2/ Chr\_14; *qLinn*004 and *qLinn*005 on LG-E/Chr\_15; *qLinn*006 and *qLinn*007 on LG-J/Chr\_16). The result of QTL analysis provides clue that, parental lines MD 96-5722 and "Spencer" each have beneficial alleles at different loci controlling protein, oil and fatty acids concentrations.

#### 4. Discussion

Linkage mapping has been assisting soybean breeding programs extensively, by identifying QTL for protein and oil contents with a range of genetic backgrounds and in different environments [20,27-29]. Various soybean lines such as wild and cultivated soybeans and genotypes from different countries have also been used to explore seed protein QTL [26,27,29]. Here a QTL for protein on LG B2 (Chr\_14) was identified, which was overlapped with one of oil QTL (qOil006) on the same linkage group or chromosome (Table 2, Figure 1). This overlapping or pleiotropic effect of protein and oil QTL within homeologous regions inferred a rearrangement of the QTL in homeologous pairs that may occurred due to duplicationevent [30,31]. Previously six QTL were identified with SNPs for oil contents (qOil001 - qOil006) in the PI 438489B by Hamilton population [11]; among these six, two QTL (qOil007 and qOil008) were identified on LG-B2 (Chr\_14). However, their positions were different from the QTL identified in this study. Another recent study identified 11 QTL for oil concentration in a RIL population of "OAC Wallace" and "OAC Glencoe" with SSR markers on nine different chromosomes; specifically1 (LG-D1a), 7 (LG-M), 9 (LG-K), 12 (LG-H), 13 (LG-F), 14 (LG-B2), 16 (LG-J), and 17 (LG-D2) [32]. Many linkage groups mentioned above are common with our findings regarding oil QTL but the cM positions are different.

The results of QTL analysis showed a total of 16 QTL

for fatty acids (Table 2, Figure 1). Among these fatty acids QTL, two QTL associating with palmitic acid identified on LG-N (Chr 3) and LG-G (Chr 18) with LOD scores of 3.21 and 4.80 respectively. Reinprecht et al. also reported a QTL for palmitic acid on LG-N but in different position [33]. However, not identified here but were reported earlier palmitic acid QTL on LG-D2,LG-K, and LG-L by Moongkanna et al., on LG-A1, B2 by Hyten et al., on J and M by Diers and Shoemaker, on LG-A1 and LG-M by Li et al., and on LG-D1b and LG-A2 by Panthee et al. [3,34-37]. A QTL and SNP markers associated with stearic acid content were found on LG-J (Chr 16) (Table 2, Figure 1). Previously, Diers and Shoemaker [34] and Panthee et al. [37] also reported QTL for stearic acid composition on LG-J (Chr 16). Other groups identified such QTL on different linkage groups such as, Panthee et al., Brummer et al., and Spencer et al. on LG-B2 [37-39]. Moongkanna et al. located QTL on LG-A1, C2, E, and O [3]. More stearic acid QTL were also mapped on LG-C2, L by Hyten et al., on LG-F, G, M by Reinprecht et al., and on LG-B2 by Spencer et al. [33,34,39].

Three QTL for oleic acid were identified on LG-F (Chr-13) and LG-J (Chr-16) with LOD scores ranged from 3.39 to 3.60 (Table 2, Figure 1). The findings here on oleic acid QTL are different from many other reports. For example, Moongkanna et al. located 8QTL linked to high oleic acid percentage on LG-A1, G and H [3]; Panthee et al. reported a QTL on LG-E [37]; Monteros et al. reported 2 QTL on LG-A1, D2 and G [40]; Hyten et al. (2004) reported 2 QTL on LG-D1b and L [34]; and Bachlava et al. were on LG-I, L and O [41]. Three QTL underlying linoleic acid content were identified on two different LG-F (Chr\_13) and LG-J (Chr\_16) (Table 2, Figure 1). One QTL was identified by Hyten *et al.* at different position but on the same LG-F, they also detected another QTL on LG-L [34]. No similar positions or linkage groups were so far found for linoleic acid contents from the past studies. For example, Moongkanna et al. identified seven SSR markers associated with linoleic acid on LG-A1, G, H, and Panthee et al. found a QTL on LG-E [3,37].Based on our CIM analysis, there were 7 linolenic acid QTL identified and these are located on LG-F (Chr\_13), LG\_B2 (Chr\_14), LG-E (Chr\_15), and LG-J (Chr\_16) (Table 2, Figure 1). QTL for linolenic acid was earlier reported on LG-E, G, H by Moongkanna et al., [3] on LG-B2 by Spencer et al., and Byrum et al. [39,42], on LG-C2, E, H, O by Shibata et al. [43], LG-E, K by Diers and Shoemaker [35], on LG-E, G by Panthee et al. [37], on LG-F, L by Hyten et al. [34] and on LG-E, K by Reinprecht et al. [33]. The finding here of linolenic acid QTL on LG-E and LG-F are in agreement with some earlier reports cited above.

Some of the QTL among 28 identified here on specific

linkage groups or chromosomes were common to the past studies but the positions of the QTL were different. This may be because many of the previous OTL were discovered through simple linear regression methods (SIM) not by composite interval mapping (CIM), also they used different types of markers, different populations and plant populations also grow in different environments. In past studies, there was also few identical QTL identified in same experimental population grown in different environments by different researchers or in different years [44,45]. Although the development of a more saturated genetic linkage map would enhance the chance of identification of more QTL of protein, oil and fatty acids, especially within the gaps in our current genetic map, multiple location experiments are needed to determine the QTL environmental stability.

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