

QTL for fatty acid composition and yield in linseed (*Linum usitatissimum* L.)

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Received: 14 October 2014 / Accepted: 11 February 2015 / Published online: 8 March 2015
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Abstract

Key message The combined SSR-SNP map and 20 QTL for agronomic and quality traits will assist in marker assisted breeding as well as map-based cloning of key genes in linseed.

Abstract Flax is an important nutraceutical crop mostly because it is a rich source of omega-3 fatty acids and antioxidant compounds. Canada is the largest producer and exporter of oilseed flax (or linseed), creating a growing need to improve crop productivity and quality. In this study, a genetic map was constructed based on selected 329 single nucleotide

polymorphic markers and 362 simple sequence repeat markers using a recombinant inbred line population of 243 individuals from a cross between the Canadian varieties CDC Bethune and Macbeth. The genetic map consisted of 15 linkage groups comprising 691 markers with an average marker density of one marker every 1.9 cM. A total of 20 quantitative trait loci (QTL) were identified corresponding to 14 traits. Three QTL each for oleic acid and stearic acid, two QTL each for linoleic acid and iodine value and one each for palmitic acid, linolenic acid, oil content, seed protein, cell wall, straw weight, thousand seed weight, seeds per boll, yield and days to maturity were identified. The QTL for cell wall, straw weight, seeds per boll, yield and days to maturity all co-located on linkage group 4. Analysis of the candidate gene regions underlying the QTL identified proteins involved in cell wall and fibre synthesis, fatty acid biosynthesis as well as their metabolism and yield component traits. This study provides the foundation for assisting in map-based cloning of the QTL and marker assisted selection of a wide range of quality and agronomic traits in linseed and potentially fibre flax.

Communicated by A. J. Bervillé.

Electronic supplementary material The online version of this article (doi:10.1007/s00122-015-2483-3) contains supplementary material, which is available to authorized users.

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Introduction

Flax (*Linum usitatissimum* L., $2n = 2x = 30$) is a self-pollinated annual crop belonging to the Linaceae family that has been known to mankind since the Paleolithic era (30,000 years ago) (Zohary 1999). It is believed to have originated in India or the Middle East (Vavilov 1951). Flax is a dual purpose crop grown for its stem fibre (fibre flax) and oil (linseed, oilseed flax or flaxseed). The linseed and fibre types belong to the same species but are morphologically, anatomically, physiologically and agronomically distinct as a result of divergent selection (Diederichsen and Ulrich 2009). Linseed plants are shorter and more

branched, and branches cover a greater proportion of the main stem compared to fibre flax. The seeds are larger and the seed yield is higher because this plant type was primarily selected for its seed yield and quality.

Fibre flax is mainly grown in Europe, Russia and China while Canada is the world's largest producer and exporter of linseed (FAOSTAT 2014). Flaxseed oil is a component of various biodegradable products such as linoleum flooring, paints and varnishes. Flax oil is rich in omega-3 fatty acids which improve cardiac and bone health when consumed by humans and animals (Kim and Ilich 2011; Leyva et al. 2011). Flax stems contain cellulose-rich bast fibres used in textile industry whereas the shorter lignin-rich xylem fibres are manufactured into biodegradable composites for housing and automotive industries (Summerscales et al. 2010). Hybrid composite fibres made of flax and carbon fibres have been characterized with improved water absorption behaviour and overall strength (Dhakal et al. 2013). In the past decade, the flax industry has devoted resources to develop dual purpose flax where high-value products from linseed stems could be used in the pulp, technical fibre and biofuel industries. The government–industry partnership has generated ~\$25 million in funding (Canadian flax industry update 2011; www.flaxcouncil.ca/files/web/FlaxIndustryUpdate).

The importance and value of the crop have been the justification for the development of genetic resources such as the first whole genome shotgun (WGS) sequence (Wang et al. 2012), expressed sequence tags (ESTs) (Venglat et al. 2011), a simple sequence repeat (SSR) consensus genetic map (Cloutier et al. 2012), a physical map (Ragupathy et al. 2011) and thousands of single nucleotide polymorphic (SNP) markers (Kumar et al. 2012). The ~370 Mb flax genome is estimated to have undergone whole genome duplication approximately, 5–9 million years ago. However, recent studies based on flax transcriptome analyses suggest an earlier whole genome duplication event, dating 20–40 million years ago (Muhlhausen and Kollmar 2013; Sveinsson et al. 2013). QTL underlying linolenic and linoleic acid contents were identified on two linkage groups using an SSR-based linkage map from a cross between SP2047, a Solin™ line generated using mutation breeding with 2–4 % linolenic acid (LIN) and UGG5-5, a brown seeded breeding line with 63–66 % LIN (Cloutier et al. 2011). The gene encoding fatty acid desaturase 3A co-located with the QTL on linkage group 7 and was hypothesized to be the candidate gene. QTL for seed quality traits (Soto-Cerda et al. 2014b), yield and agronomic components (Soto-Cerda et al. 2014a) were identified by association mapping based on more than 450 SSR markers from a core collection of 407 flax accessions.

Oil content (OIL) in current Canadian linseed varieties, ranges between 45 and 50 % but levels less than 32 % have been observed in fibre flax accessions. Linseed oil is composed of five main fatty acids: palmitic (PAL, C16:0, 6 %),

stearic (STE, C18:0, 4.4 %), oleic (OLE, C18:1^{Δ9}, 24.2 %), linoleic (LIO, C18:2^{Δ9, 12}, 15.3 %) and linolenic (LIN, C18:3^{Δ9, 12, 15}, 50.1 %) (Westcott and Muir 2003). STE is the primary substrate that undergoes three desaturations, to first be converted into OLE, then LIO and finally, LIN. Linseed's high proportion of LIN imparts the oil with the drying properties desired for the fabrication of paints, varnishes and linoleum floorings (Cullis 2007). A few varieties with more than 70 % LIN have been developed (Friedt et al. 1995) and, a high-LIN variety with 68 % LIN called NuLin™ 50 has been registered in Canada (www.viterra.ca). The high-LIN content makes the oil highly susceptible to oxidation rendering it unsuitable for many food applications. To meet the fatty acid composition profile of the margarine industry, mutation breeding efforts led to development of varieties with reduced LIN levels (~3 %), known as Linola™ or Solin™ (Green 1986; Rowland 1991). The fatty acid composition of Solin™ oil is similar to other premium polyunsaturated oils such as sunflower. Solin™ oil (C16:0, 6 %), (C18:0, 4 %), (C18:1^{Δ9}, 16 %), (C18:2^{Δ9, 12}, 72 %) and (C18:3^{Δ9, 12, 15}, 2 %) has a high LIO content (Green 1995). Oils from these varieties have higher solidification temperatures that are suitable for the margarine industry (Dribnenki and Green 1995; Dribnenki et al. 2007). Unfortunately, the market niches for these specialty linseed varieties remain underdeveloped.

Linseed yields of 2.5 tonnes per hectare (t/ha) were reported in field plots, (Soto-Cerda et al. 2014b) although the crop yield worldwide is less than 1 t/ha (FAOSTAT 2014). Even in the major producing countries, yield averages only 1.4 t/ha. Yield therefore, remains the most important breeding objective because linseed must compete against other crops. The comparatively small investments in flax breeding, the lack of a good hybrid system and the industry's sensitivity to genetically modified linseed leaves breeders with limited, short and medium term options to tackle the yield gap. Hence, conventional breeding approaches incorporating markers associated with quantitative trait loci (QTL) for yield and yield components represent an attractive option.

In this study, a genetic map was developed using SSR and SNP markers based on a population (BM) of 243 recombinant inbred lines (RILs) generated from a cross between CDC Bethune and Macbeth. The phenotypic data was collected in four consecutive years at two locations and QTL analyses were performed for agronomic, seed and fibre traits.

Materials and methods

Plant materials, experimental design, phenotyping and statistical analysis

A RIL population of 243 individuals from a cross between the Canadian cultivars CDC Bethune (Rowland et al. 2002)

and Macbeth (Duguid et al. 2003b) was grown in the field in a type-2 modified augmented design (MAD) (Lin and Poushinsky 1985). Main plots were arranged in grids of seven rows and seven columns. Each main plot was divided into seven parallel subplots (1.5 m × 2 m with a 20 cm row spacing) with a plot control (CDC Bethune) located in the centre of each main plot. Additional subplot controls, 19 each of the cultivars Hanley (Duguid et al. 2003a) and Macbeth, were assigned to randomly selected main plots and, the RILs were randomly assigned to the remaining subplots. Field experiments were carried out at two locations, namely Morden, Manitoba (M) and Kernen Crop Research Farm located near Saskatoon, Saskatchewan (S) in Canada, during 2009, 2010, 2011 and 2012, for a total of eight environments. Phenotypic data for fatty acid composition (PAL, STE, OLE, LIO and LIN), iodine value (IOD), oil content (OIL), seed yield (YLD), fibre components [cell wall (CW), cellulose (CEL) and lignin (LIG)] were obtained from all eight environments while data for straw weight (SW), height (HGT), thousand seed weight (TSW), seeds per unit area (SPA), seeds per boll (SPB), seed protein content (PRO) and days to maturity (DM) were obtained from six environments (2010–2012). A total of 1 g of seed from each line/location/year was subsampled to measure OIL (%) and fatty acid composition as previously described (Soto-Cerda et al. 2014a). PRO was obtained by near-infrared (NIR) spectroscopy calibrated against the Combustion Analysis Reference Method and expressed on an N × 6.25 dry basis. Fibre traits (CW, CEL, and LIG) were determined by NIR spectroscopy while SW measured the fresh weight of the straw of each 0.5 m row after boll stripping. Phenotypic measurements of the agronomic traits YLD, HGT, TSW, SPA, SPB and DM were collected as previously described (Soto-Cerda et al. 2014b).

The phenotypic data was adjusted for soil heterogeneity using the MAD pipeline (You et al. 2013). Broad-sense heritability (*H*) for each trait was estimated as in Soto-Cerda et al. (2014a). The error variance was estimated using the data of the three control cultivars (one main plot control and two subplot controls). The SAS GLM procedure and a custom Perl script were used to calculate the broad-sense heritability. Analysis of variance (ANOVA) was performed with the PROC GLM (fixed model) procedure of SAS. An overall mean dataset was generated by averaging the phenotypic traits over all environments and Pearson correlation coefficients between pairs of traits were determined by PROC CORR. All analyses of phenotypic data were carried out using SAS v9.3 (SAS Institute, NC, USA).

Genetic and physical mapping

A genetic map of the BM population consisting of 389 SSR markers from 243 RILs was previously constructed and

used in conjunction with two other maps to build a consensus genetic map of flax (Cloutier et al. 2012). To discover SNPs from the same population, genomic DNA from the parental lines and 96 RILs were sequenced as paired end reads of 100 bp using an Illumina HiSeq 2000 as previously described (Kumar et al. 2012). The genome-wide SNP discovery was performed using a modified AGSNP pipeline for genotyping-by-sequencing (GBS) (Kumar et al. 2012; You et al. 2012). The strict criteria applied in the pipeline eliminated false SNPs caused by mis-genotyping, producing an initial subset of 122,066 SNPs. Subsequently, the SNPs that had >20 % missing data were removed, reducing the number to 3230. The 389 SSRs previously reported for this population (Cloutier et al. 2012) and the 3230 SNPs generated by GBS were assigned coordinates based on the WGS sequence assembly of CDC Bethune (Wang et al. 2012), available on Phytozome (<http://phytozome.jgi.doe.gov/>). For SNP markers, the precise coordinates of alternative bases/alleles were used whereas for SSRs, the coordinates corresponding to the first base of the repeat were used. SSR and SNP marker names were tagged with linkage group number, contig number, scaffold number and SNP position on the scaffold. A SSR–SNP genetic map using the above 389 SSRs and 3230 SNPs was generated using MapDisto (Lorieux 2012). Of the 3230 SNPs, we retained only 379 corresponding to SNPs that did not map with other SNPs and were approximately spaced every 4 cM apart and that mapped to regions not covered by SSRs. Information on the genomic context of each SNP is provided as a list comprising 100 bp flanking sequence on either side of each SNP (ESM1). Finally, the 389 SSRs and 379 SNPs were used to generate a combined SSR–SNP genetic map for the BM population mentioned above using JoinMap (Stam 1993) with the goal of producing a genetic map achieving comprehensive coverage using a minimal marker set.

QTL analyses

QTL analyses were performed using the single trait multiple interval mapping (MIM) function (Kao et al. 1999) as implemented in the Windows Qgene version 4.3.10. Cofactors selection performed using forward, backward and stepwise manner with the scan interval set at 10 cM yielded consistent results with all three methods and hence, the ‘forward cofactor selection’ method with default settings was adopted. The LOD thresholds for individual traits were determined by 1000 permutations at $P < 0.05$ level (Churchill and Doerge 1994). QTL were declared when the LOD score was greater than the threshold value in the overall mean dataset and in at least half of the environments. The estimates of additive effect and coefficient of determination (R^2) explaining the percentage of phenotypic

Table 1 Description of the linkage groups (LGs) constituting the combined simple sequence repeat (SSR) and single nucleotide polymorphism (SNP) based genetic map of the recombinant inbred line population derived from CDC Bethune/Macbeth

Linkage group	Number of markers	Marker type		Density (marker/cM)	Length of LGs (cM)
		SSR	SNP		
1	47	23	24	1.7	80
2	52	38	14	2.1	107
3	58	35	23	2.0	115
4	55	34	21	2.0	108
5	28	22	6	1.3	37
6	61	38	23	1.2	71
7	43	20	23	1.5	64
8	69	37	32	1.8	127
9	51	22	29	1.5	75
10	48	17	31	1.7	83
11	25	11	14	3.1	77
12	61	31	30	1.7	103
13	35	12	23	2.3	82
14	43	15	28	2.2	93
15	15	7	8	3.0	44
Total	691	362	329	1.9	1266

variance governed by the putative QTL was obtained by MIM analysis. The genetic map showing the QTL was drawn using Mapchart version 2.2 (Voorrips 2002).

Gene identification

The gene identification was performed using the Gbrowse feature of the CDC Bethune genomic DNA sequence available on the Phytozome server (<http://phytozome.jgi.doe.gov/>). Either the region between the markers where a QTL was identified or the 1Mbp region up- and downstream of the marker coordinates linked to a QTL was scanned for all annotated genes and their functional classes were determined. In the absence of annotations, the predicted gene and its encoded protein sequence were analyzed by BLAST against the nucleotide sequence and encoded protein databases available at the National Center for Biotechnology Information (NCBI) and Swiss Institute of Bioinformatics (ExPasy). The list of gene sequences was then curated based on their putative role in the phenotypic trait(s).

Results

Genetic map

A total of 691 (362 SSRs and 329 SNPs) of the selected 389 SSRs and 379 SNPs grouped into 15 linkage groups (LGs) totalling 1266 cM (Table 1, ESM2). The average LG length was 84 cM and the average marker density was

estimated to be one marker per 1.9 cM with LG 11 having the highest marker density and LG6 the lowest.

Phenotypic analysis

The mean, range and broad-sense heritability (H) for PAL, STE, OLE, LIO, LIN, IOD, OIL, PRO, CW, SW, TSW, SPB, YLD and DM are summarized in Table 2. Broad-sense heritability was high for all fatty acids (0.98–0.99) and low for a complex trait such as yield (0.53) (Table 2). Transgressive segregants were observed for all traits (Fig. 1). Significant variability for genotype (G), year (Y) and location (L) was observed for all traits except for L of PAL (Table 3). Interactions between G, Y, and L were significant for all traits except in four instances. Some correlations between traits were observed using Pearson correlation coefficients (Table 4). For example, LIN was negatively correlated to all of its precursors in the FA biosynthetic pathway, (Table 4) while TSW was correlated with OIL, PRO and YLD but negatively correlated with LIN, SPB and DM. YLD was also positively correlated with SPB.

QTL analyses

A total of 20 QTL were detected for 14 traits based on the RIL population evaluated in multiple environments (Table 5; Fig. 2). QTL for CW, SW, SPB, YLD and DM co-located with marker Lu2031 on LG4 (Fig. 2). The QTL for CW had a peak LOD of 8 and accounted for 14 % of the phenotypic variation whereas for SW, the LOD peak

Table 2 Mean and range for fibre, seed and yield related traits calculated across environments and locations in a recombinant inbred line population derived from CDC Bethune/Macbeth

Trait	Abbreviation	CDC Bethune/Macbeth recombinant inbred line population			Broad sense heritability (<i>H</i>)	CDC Bethune	Macbeth
		Mean \pm SE	Min.	Max.			
Palmitic acid (%)	PAL	5.0 \pm 0.1	4.5	5.9	0.98	5.0 \pm 0.1	4.9 \pm 0.1
Stearic acid (%)	STE	3.6 \pm 0.2	2.6	4.6	0.98	3.7 \pm 0.2	3.8 \pm 0.2
Oleic acid (%)	OLE	20.0 \pm 1.5	16.4	25.3	0.99	21.4 \pm 1.7	17.9 \pm 1.3
Linoleic acid (%)	LIO	16.0 \pm 0.3	13.2	18.3	0.99	15.1 \pm 0.3	16.2 \pm 0.4
Linolenic acid (%)	LIN	55.4 \pm 1.4	49.9	61.7	0.98	54.7 \pm 1.6	57.2 \pm 1.1
Iodine value	IOD	189.8 \pm 2.7	179.0	198.7	0.98	187.6 \pm 3.2	193.2 \pm 2.2
Oil content (%)	OIL	45.2 \pm 0.6	42.7	48.5	0.95	44.6 \pm 0.7	46.3 \pm 0.8
Seed protein (%)	PRO	25.0 \pm 1.3	23.3	27	0.90	24.6 \pm 1.4	24.1 \pm 1.3
Cell wall (%)	CW	79.9 \pm 1.1	78.0	81.8	0.92	79.3 \pm 1.2	80.2 \pm 1.2
Straw weight (g)	SW	24.7 \pm 4.3	14.4	36.3	0.83	24.7 \pm 4.3	21.5 \pm 2.5
Thousand seed weight (g)	TSW	5.8 \pm 0.3	5.0	7.0	0.82	5.5 \pm 0.3	6.0 \pm 0.3
Seeds per boll	SPB	7.0 \pm 0.5	5.5	8.0	0.81	7.1 \pm 0.6	6.9 \pm 0.4
Yield (t/ha)	YLD	1.6 \pm 2.2	1.3	1.8	0.53	1.6 \pm 0.3	1.7 \pm 0.2
Days to Maturity	DM	94.7 \pm 3.1	90	102	0.89	95.7 \pm 3.5	96.0 \pm 2.7

was 19 and accounted for 30 % of the phenotypic variation based on the mean dataset (Table 5). The 11 QTL for fatty acid composition and IOD were located on five LGs (1, 3, 5, 6 and 7) with QTL for OLE, LIN and IOD co-located on LG5 and QTL for LIO and OLE co-located on LG3. Three major QTL for OLE (*QOle.BM.crc-LG3-1*, *QOle.BM.crc-LG3-2*, *QOle.BM.crc-LG5*) were identified, contributing 38 % of the phenotypic variability observed for OLE content (Table 5). One QTL each for OIL (*QOil.BM.crc-LG8*) and seed protein (*QPro.BM.crc-LG11*) were identified with LOD scores of 7, accounting for 13 and 11 % of the phenotypic variation, respectively. A minor QTL for TSW (*QTSW.BM.crc-LG15*) was identified in three out of the four environments studied with a LOD peak of 5 and accounted for 9 % of the phenotypic variation.

Genes underlying QTL

The genomic locations of markers that were identified to harbour QTL were scanned using the Gbrowse feature on Phytozome (<http://phytozome.jgi.doe.gov/>), for the presence of all annotated genes (ESM3) and a subset of genes known to affect the underlying traits is listed in Table 6. The region including SSR marker Lu2031 on LG4 and associated with QTL for CW, SW, SPB, YLD and DM is proximal to a number of candidate genes encoding proteins that could be involved in controlling these traits (Table 6). They include several genes potentially regulating CW synthesis, such as UDP-glycosyltransferase superfamily, laccase, xylosidase and nudix hydrolase family proteins. Genes like plasmodesmata callose-binding protein, pectate

lyase family protein are candidates for SW while remorin family protein and COBRA-like protein could play a role in both CW and SW. Genes encoding pollen Ole 1 family and actin cross-linking proteins have putative functions in controlling SPB. Various transcription factors such as GRAS family, WRKY family and genes like Teosinte Branched 1 found at the locus could potentially have an effect on yield. Light-regulated and senescence-related genes are putative candidates for controlling DM (Table 6).

The proteins underlying QTL for fatty acid composition include 3-ketoacyl-acyl carrier protein synthases (KASI and KASIII), histidine box containing HXXXD-type acyl-transferase (H-AT), fatty acid desaturases (SAD and FAD2), fatty acid reductases and fatty acid synthase 1 (FAS1). The QTL for PRO harbours candidate genes such as late embryogenesis abundant protein, seed storage 2S albumin superfamily protein and ribosomal protein S5. The QTL for TSW on LG15 encompasses genes encoding proteins for leucine-rich receptor-like protein kinase family, cytochrome P450 family, as well as WRKY and GRAS family transcription factors. While the above list is not exhaustive, it aims to show that the QTL identified herein underlie candidate genes with functions known to be related to the traits (Table 6).

Discussion

The current study was intended to identify QTL for agronomic, fibre and seed quality traits from a cross between two modern Canadian varieties: CDC Bethune (Rowland

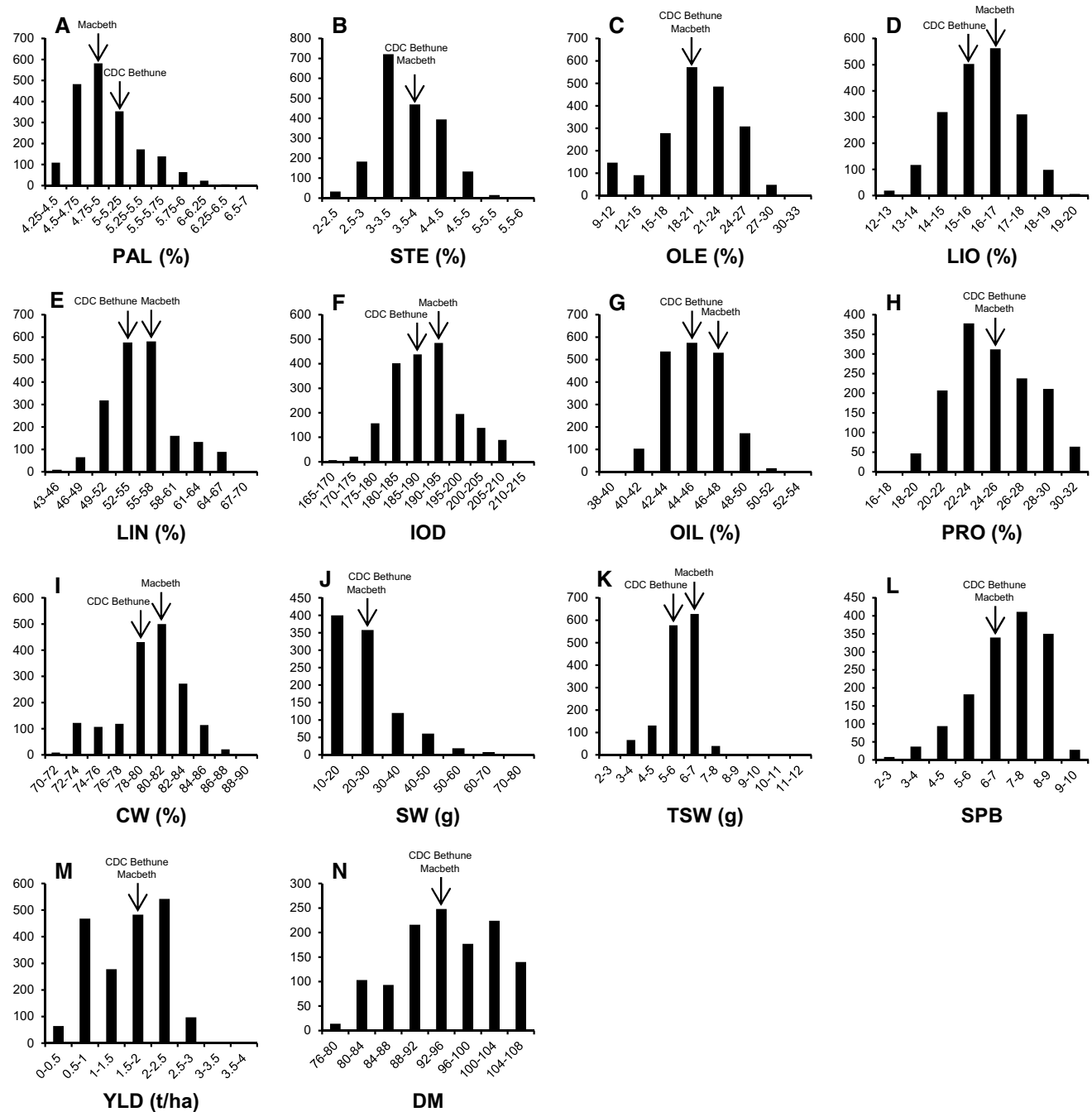


Fig. 1 Phenotypic distribution of palmitic acid (a), stearic acid (b), oleic acid (c), linoleic acid (d), linolenic acid (e), iodine value (f), oil content (g) seed protein (h), cell wall (i), straw weight (j), thousand seed weight (k), seeds per boll (l), yield (m) and days to maturity (n)

in the flax CDC Bethune/Macbeth RIL population evaluated in multiple environments. *Arrows* indicate the interval corresponding to the mean phenotypic values of the parents

et al. 2002) and Macbeth (Duguid et al. 2003). CDC Bethune was developed from the cross between NorMan (Kenaschuk and Hoes 1986) and FP857 while Macbeth originated from the cross between M2701 and AC Linora (Kenaschuk and Rashid 1993). These varieties were chosen because they are adapted to Canadian growing conditions

and QTL identified can be easily incorporated into adapted germplasm. Both have similar maturity, height, seed size, oil quality and LIN content with high protein content and good lodging resistance but CDC Bethune consistently out yields Macbeth in co-op trials (Duguid et al. 2003; Rowland et al. 2002).

Table 3 Analysis of variance for estimation of components of variance due to year, location and genotype for the 14 traits from which QTL were identified

Trait ^a	Source of variations													
	G		Y		L		Y × L		Y × G		L × G		Y × L × G	
	MS	%TSS	MS	%TSS	MS	%TSS	MS	%TSS	MS	%TSS	MS	%TSS	MS	%TSS
PAL	0.93***	55.59	15.80***	11.51	0.03	0.01	10.74***	7.82	0.03***	5.19	0.03***	1.98	0.03***	4.74
STE	1.24***	31.70	56.24***	17.66	192.44***	20.14	12.38***	3.89	0.02***	1.90	0.09***	2.40	0.02***	1.61
OLE	31.09***	15.20	1267.60***	7.59	19065.79***	38.04	2506.82***	15.01	0.71***	1.04	1.54***	0.75	0.64***	0.93
LIO	7.85***	45.56	164.47***	11.68	743.58***	17.61	22.43***	1.59	0.26***	4.45	0.54***	3.11	0.18	3.12
LIN	31.58***	17.01	1048.98***	6.92	15560.33***	34.20	2490.12***	16.42	0.95***	1.53	2.29***	1.23	0.80***	1.27
IOD	104.73***	15.30	3967.68***	7.10	64833.84***	38.66	7576.69***	13.55	2.74***	1.20	7.26***	1.06	2.58***	1.12
OIL	10.63***	20.98	647.77***	15.66	2906.27***	23.42	192.75***	4.66	1.03***	6.12	0.98***	1.94	0.86***	5.03
PRO	3.06***	4.06	878.32***	9.52	6573.50***	35.64	1761.64***	19.10	0.69***	1.84	0.85***	1.13	0.65***	1.73
CW	3.47***	3.59	581.79***	7.37	991.29***	4.19	5333.25***	45.06	2.28*	7.07	2.24	2.31	2.03	4.15
SW	102.06***	20.42	3027.66***	4.95	20999.86***	17.15	^b	^b	14.18	5.62	52.48***	10.29	^b	^b
TSW	0.78***	14.12	134.24***	19.80	75.55***	11.15	93.25***	27.51	0.23***	8.29	0.20***	3.62	0.21***	7.57
SPB	1.63***	11.44	45.00***	2.58	868.90***	49.87	29.23***	3.36	0.55***	7.71	0.95***	6.67	0.42***	5.76
YLD	11.31***	2.39	6198.21***	16.00	11508.33***	9.90	12412.83***	32.04	12.05***	7.62	12.49***	2.63	6.72***	4.22
DM	34.08***	0.04	15168.08***	18.25	15353.03***	18.47	1885.35***	2.27	7.19***	0.01	10.74***	0.01	8.55***	0.01

G genotype, Y year, L location, MS mean square values, %TSS percentage of the total sum of squares

* P < 0.05; ** P < 0.01; *** P < 0.001

^a Traits as per Table 2

^b Could not be estimated because of missing data for Morden

Table 4 Pearson correlation coefficients calculated from the means across environments and locations amongst the traits for which QTL were detected in the recombinant inbred line population CDC Bethune/Macbeth

Trait ^a	PAL	STE	OLE	LJO	LIN	IOD	OIL	PRO	CW	SW	TSW	SPB	YLD
STE	-0.24***												
OLE	0.06	0.15*											
LJO	0.30***	-0.42***	-0.06										
LIN	-0.32***	-0.07	-0.86***	-0.41***									
IOD	-0.31***	-0.25***	-0.92***	-0.16*	0.96***								
OIL	-0.14*	0.06	0.27***	0.01	-0.22***	-0.22***							
PRO	-0.07	-0.35***	0.04	0.20**	-0.06	0.03	0.10						
CW	-0.10	-0.06	-0.13*	0.01	0.14*	0.15*	0.08	0.10					
SW	0.25***	0.01	0.09	0.09	-0.17**	-0.17**	0.19**	-0.23***	-0.25***				
TSW	-0.09	-0.17**	0.17**	0.07	-0.13*	-0.09	0.28***	0.36***	0.12	-0.28***			
SPB	0.04	-0.28***	-0.16*	0.31***	0.03	0.13*	0.07	0.33***	0.25***	-0.42***	-0.13*		
YLD	-0.21***	0.15*	-0.02	-0.06	0.05	0.04	0.12	-0.01	0.03	-0.15*	0.13*	0.32***	
DM	0.03	0.33***	0.18**	-0.19**	-0.13*	-0.21***	-0.12	-0.37***	-0.32***	0.60***	-0.33***	-0.66***	-0.18**

* $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$ ^a Traits as per Table 2

Table 5 Putative QTL detected for fibre traits, fatty acid composition, yield and days to maturity in the linseed CDC Bethune/Macbeth RIL population

Trait ^a	Linkage group	Marker	QTL ^b	Environment	LOD ^c	Add ^d	R ^{2e}
PAL	7	Lu402/Lu7-1820805	<i>QPal.BM.crc-LG7</i>	M-2009	7	−0.11	0.13
				S-2009	5	−0.09	0.08
				M-2010	4	−0.09	0.08
				S-2011	4	−0.08	0.07
				M-2012	4	−0.09	0.07
				S-2012	5	−0.09	0.10
				Overall mean	6	−0.10	0.12
STE	1	Lu2183a/Lu1-2670961	<i>QSte.BM.crc-LG1</i>	M-2009	4	−0.09	0.07
				S-2009	5	−0.09	0.08
				S-2010	4	−0.07	0.07
				S-2012	4	−0.08	0.06
				Overall mean	3	−0.08	0.06
STE	3	Lu3-8415336/Lu2164	<i>QSte.BM.crc-LG3</i>	M-2009	3	0.11	0.06
				M-2010	7	0.21	0.13
				M-2011	10	0.25	0.17
				S-2011	6	0.16	0.11
				M-2012	10	0.23	0.17
STE	11	Lu2128/Lu11-19000928	<i>QSte.BM.crc-LG11</i>	Overall mean	7	0.16	0.12
				M-2009	5	−0.13	0.09
				S-2009	6	−0.13	0.10
				S-2010	9	−0.13	0.15
				S-2011	49	−0.13	0.07
				M-2012	59	−0.17	0.09
				S-2012	4	−0.11	0.07
OLE	3	Lu3-3979616/Lu3-5950394	<i>QOle.BM.crc-LG3-1</i>	Overall mean	5	−0.13	0.08
				M-2010	8	0.89	0.13
				M-2011	7	0.85	0.13
				M-2012	4	0.60	0.07
				S-2012	4	0.49	0.08
OLE	3	Lu658/Lu3150	<i>QOle.BM.crc-LG3-2</i>	Overall mean	7	0.66	0.13
				S-2009	6	−0.44	0.10
				S-2010	4	−0.26	0.07
				M-2012	8	−0.65	0.14
				S-2012	5	−0.42	0.09
OLE	5	Lu5-9728492	<i>QOle.BM.crc-LG5</i>	Overall mean	7	−0.51	0.13
				S-2009	6	0.44	0.11
				M-2010	5	0.54	0.09
				S-2010	5	0.29	0.10
				M-2011	6	0.56	0.10
				S-2011	4	0.43	0.08
				M-2012	7	0.60	0.12
LIO	3	Lu3-3979616/Lu3-5950394	<i>QLio.BM.crc-LG3</i>	S-2012	5	0.40	0.09
				Overall mean	7	0.47	0.12
				M-2009	5	−0.37	0.09
				S-2009	4	−0.31	0.07
				M-2010	7	−0.49	0.12
LIO	3	Lu3-3979616/Lu3-5950394	<i>QLio.BM.crc-LG3</i>	M-2011	4	−0.42	0.08
				Overall mean	5	−0.32	0.08

Table 5 continued

Trait ^a	Linkage group	Marker	QTL ^b	Environment	LOD ^c	Add ^d	R ^{2e}
LIO	6	Lu2545	<i>QLio.BM.crc-LG6</i>	M-2009	3	−0.25	0.06
				M-2010	3	−0.26	0.06
				S-2011	4	−0.23	0.07
				M-2012	5	−0.32	0.09
				S-2012	3	−0.19	0.05
				Overall mean	4	−0.23	0.07
LIN	5	Lu5-9728492	<i>QLin.BM.crc-LG5</i>	M-2009	3	−0.49	0.06
				S-2009	5	−0.47	0.10
				M-2010	4	−0.54	0.07
				S-2010	6	−0.47	0.10
				M-2011	4	−0.62	0.08
				S-2011	4	−0.48	0.07
				M-2012	6	−0.65	0.10
				S-2012	5	−0.48	0.09
				Overall mean	5	−0.52	0.10
				IOD	5	Lu5-9728492	<i>QIod.BM.crc-LG5</i>
S-2009	6	−0.91	0.11				
M-2010	3	−0.94	0.06				
S-2010	9	−0.89	0.15				
M-2011	5	−1.14	0.09				
S-2011	4	−0.86	0.08				
M-2012	6	−1.09	0.10				
S-2012	6	−0.86	0.10				
Overall mean	7	−0.97	0.12				
IOD	6	Lu6-2260313/Lu6-2330258	<i>QIod.BM.crc-LG6</i>				
				S-2010	5	−0.68	0.08
				M-2011	3	−0.97	0.06
				M-2012	4	−0.93	0.07
				Overall mean	5	−0.86	0.08
				OIL	8	Lu8-22516618/Lu3189	<i>QOil.BM.crc-LG8</i>
M-2010	7	−0.40	0.12				
M-2011	6	−0.35	0.10				
M-2012	6	−0.32	0.11				
Overall mean	7	−0.36	0.13				
PRO	11	Lu11-21716266/Lu52	<i>QPro.BM.crc-LG11</i>				
				M-2011	6	0.20	0.10
				S-2011	4	0.24	0.05
				M-2012	7	0.26	0.12
				Overall mean	6	0.22	0.11
				CW	4	Lu2031	<i>QCw.BM.crc-LG4</i>
S-2009	4	−0.51	0.08				
M-2010	6	−0.48	0.11				
S-2010	10	−0.52	0.17				
Overall mean	8	−0.25	0.14				
SW	4	Lu2031	<i>QSw.BM.crc-LG4</i>				
				S-2010	8	2.13	0.14
				S-2012	12	1.71	0.20
				Overall mean	19	2.47	0.30

Table 5 continued

Trait ^a	Linkage group	Marker	QTL ^b	Environment	LOD ^c	Add ^d	R ^{2e}
TSW	15	Lu2010a/Lu2001	<i>QTsw.BM.crc-LG15</i>	S-2011	5	0.09	0.09
				M-2012	4	0.15	0.07
				S-2012	6	0.10	0.11
				Overall mean	5	0.10	0.09
SPB	4	Lu2031	<i>QSpb.BM.crc-LG4</i>	M-2010	21	−0.65	0.33
				S-2010	4	−0.18	0.07
				M-2011	6	−0.38	0.11
				Overall mean	12	−0.22	0.20
YLD	4	Lu2031	<i>QYld.BM.crc-LG4</i>	S-2009	4	0.80	0.08
				M-2010	17	−2.01	0.27
				S-2010	5	−1.23	0.09
				M-2011	8	−0.94	0.15
				S-2011	4	0.59	0.07
				S-2012	4	0.72	0.06
				Overall mean	4	−0.42	0.08
DM	4	Lu2031	<i>QDm.BM.crc-LG4</i>	M-2010	19	0.02	0.31
				M-2012	5	0.01	0.09
				S-2012	10	0.02	0.17
				Overall mean	20	0.01	0.31

^a Traits as per Table 2

^b QTL nomenclature is as previously used in flax (Cloutier et al. 2011): Q for QTL followed by trait abbreviation, a period, *pmap* showing QTL analysis performed on physical map, a period, originating laboratory, a hyphen and linkage group in which the QTL is located

^c The estimated LOD score at the QTL peak

^d Additive effect contributed by the two parents at a defined locus. Positive values indicate a positive contribution to the trait by CDC Bethune and the negative values indicate a positive contribution by Macbeth. The scores are presented as absolute values

^e R² is the percentage of phenotypic variation explained by the QTL in the cross

The final goal of QTL analyses is often to envision map-based cloning towards the identification of the functional unit(s) affecting the trait. Map-based cloning requires a high-density map combined with precise phenotyping. Molecular markers such as amplified fragment length polymorphism (AFLP), restriction fragment length polymorphism (RFLP), random amplified polymorphic DNA (RAPD) and SSR have been developed in flax (Adugna et al. 2006; Cloutier et al. 2009, 2011; Everaert et al. 2001; Fu et al. 2002; Oh et al. 2000; Roose-Amsaleg et al. 2006; Spielmeyer et al. 1998; Stegniř et al. 2000). Three QTL studies have been published based on an RFLP and RAPD map of 94 markers (Oh et al. 2000), an AFLP map of 213 markers (Spielmeyer et al. 1998) and an SSR map of 113 markers (Cloutier et al. 2011). More recently, a consensus map of 770 SSR markers based on the genetic mapping of three bi-parental populations constituted a major improvement over previous maps but remained insufficiently saturated for many applications such as the fine-mapping of QTL and the subsequent map-based cloning of the candidate functional units (Cloutier et al. 2012). The even more recent development of SNPs

affords this opportunity (Kumar et al. 2012). In the current study, SNPs and SSRs were selected at regular intervals to create a fairly evenly saturated map with the aim of localizing QTL. The 243 CDC Bethune/Macbeth RIL population mapped with 691 informative markers (362 SSRs and 329 SNPs) into 15 LGs formed the basis for the QTL analyses of stem fibre, seed quality and agronomic traits.

Population and QTL analyses

Previous studies recommended that large populations of approximately 400 were preferable for QTL studies (Vales et al. 2005). However, real data analysis and simulation based studies have concluded that phenotyping precision and high-density molecular markers can improve the accuracy of QTL mapping even with a smaller population size (Yang et al. 2013). The combined use of a decently sized population, the MAD design, the number of locations and years, established phenotyping protocols and a genetic map with well distributed markers should all be factors contributing positively towards the accuracy of the QTL detected.

The QTL analyses were performed using the MIM method which uses multiple marker intervals simultaneously for mapping putative QTL. MIM uses the maximum likelihood for estimating genetic parameters and Cockerham's model for interpreting genetic parameters (Kao et al. 1999). Compared to some other interval mapping algorithms, the MIM model is more precise (Kao et al. 1999; Li et al. 2007), although each algorithm has its unique characteristics (Jourjon et al. 2005). The intent here was not a comparative analysis of algorithms and, as such, the MIM model has been used.

Trait QTL and underlying genes

The QTL for CW, SW, SPB, yield and DM were all linked to SSR marker Lu2031 on LG4 and the underlying genomic region could be classified as gene-rich. A study suggests that 15 % of the genes in a genome may be involved in CW synthesis, remodeling or turnover (Carpita et al. 2001). Expression profiling and reverse genetics approaches identified a number of genes involved with CW synthesis such as COBRA-like protein, laccase and glycosyltransferase family proteins which were also identified as genes underlying cell wall QTL in the current study (Brown et al. 2005). As cell walls are the primary component of the straw, it is not surprising to observe that CW and SW have a QTL in common.

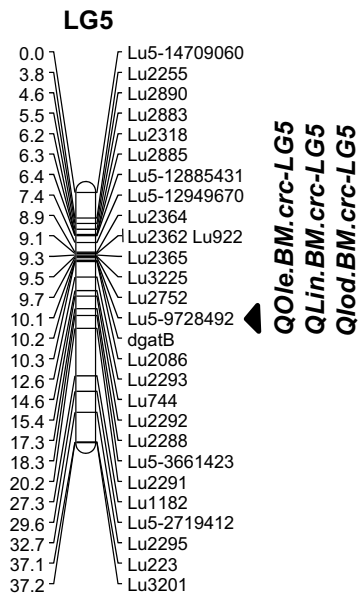
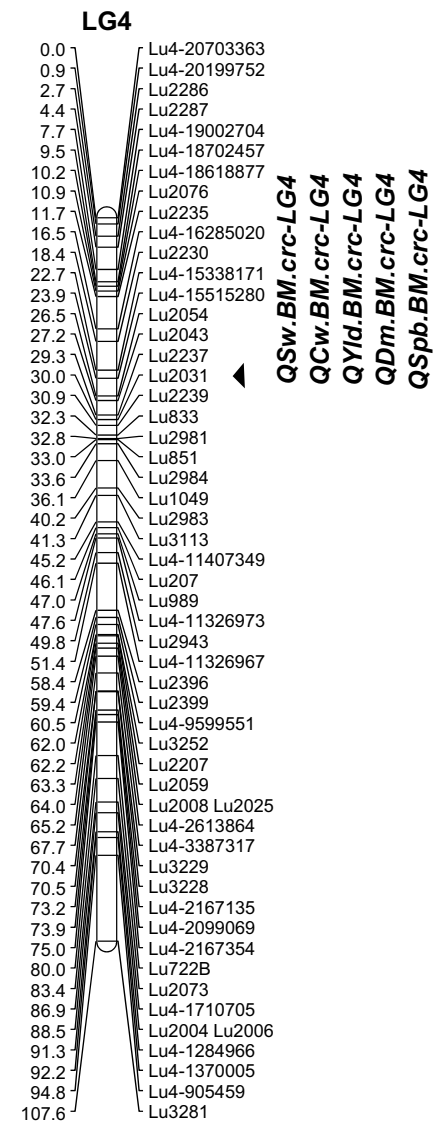
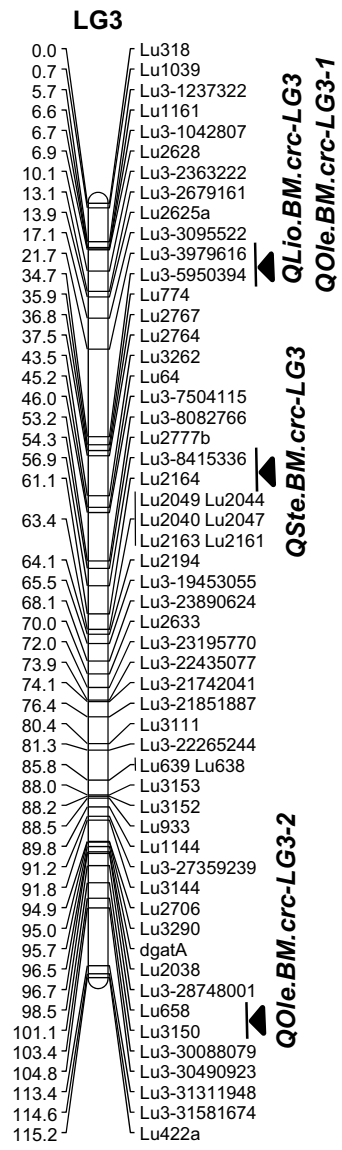
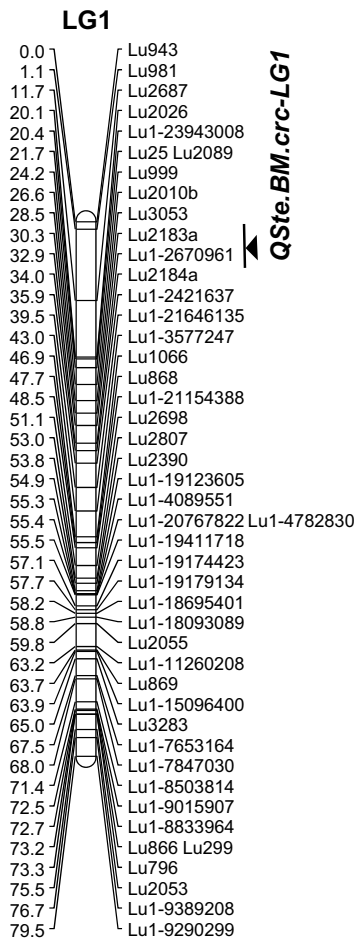
One way of measuring plant fertility is to determine the number of seeds produced per ovary. One factor influencing SPB is pollen success and, as such, genes involved in pollen–stigma interactions, pollen germination, pollen tube growth and egg cell fertilization will have an effect on the number of seeds produced. The gene encoding protein Ole e 1, which is involved in pollen hydration, pollen tube growth, and pollen–stigma interactions, is therefore, a candidate for *QSpb.BM.crc-LG4* (Muschiatti et al. 1994). These functions are consistent with the localization of Ole e 1 in the pollen exine, the sub-apical and apical regions of the pollen tube and the germination medium (Prado et al. 2013).

Genes encoding proteins known to affect yield in oil-seed crops such as diacylglycerol acyltransferase (DGAT), whose transcription level was correlated in Arabidopsis with enhanced seed weight and oil deposition (Jako et al. 2001), were also present at the YLD QTL. DGAT regulates seed oil concentration and yield in soybean (Eskandari et al. 2013). The WRKY type DNA-binding transcription factors are involved in seed cavity enlargement during seed development which determines the final seed size and yield potential (Kang et al. 2013). The WRKY and GRAS transcription factors are also key regulators of stress signaling in plants (Chen et al. 2012; Ma et al. 2010) that contribute to yield stability in changing environmental conditions.

Fig. 2 The combined SSR–SNP map of the CDC Bethune/Macbeth recombinant inbred line population comprising 691 markers (362 SSRs and 329 SNPs). *Arrows* indicate the position of QTL. QTL nomenclature: Q for QTL followed by trait abbreviation [cell wall (Cw); straw weight (Sw); palmitic acid (Pal); stearic acid (Ste); oleic acid (Ole); linoleic acid (Lio); linolenic acid (Lin); iodine value (Iod); oil content (Oil); seed protein (Pro); thousand seed weight (Tsw); seeds per boll (Spb); yield (Yld) and days to maturity (Dm)], a period, the population, a second period, the originating laboratory, a hyphen and the linkage group where the QTL located

TSW is a yield component and WRKY and GRAS transcription factors were identified underlying its QTL. Genes encoding a cytochrome P450 family protein and a leucine-rich receptor-like kinase family protein known to affect grain shape and size were also detected near the TSW QTL (Huang et al. 2013). Underlying the QTL for DM on LG4 was a *Lir1* protein whose expression is regulated by the circadian clock and activated by light (Reimmann and Dudler 1993). Mutation studies identified a role for *Lir1* in the photoperiodic regulation of flowering suggesting a potential role in determining DM.

The current study identified QTL for PAL on LG7 harbouring genes for H-AT which belongs to the BAHD acyltransferases and facilitates acyl group transfer (St-Pierre and Luca 2000). The KASIII enzyme catalyzes the condensation of acetyl–CoA and malonyl–CoA to initiate fatty acid synthesis. The malonyl-thioesters undergo recurring condensation with acetyl–CoA to form PAL catalyzed by KASI (Baud and Lepiniec 2010). The QTL for STE, identified on LG1, LG3 and LG11, accounting for 26 % of the phenotypic variation, differed from a previously reported QTL for STE discovered through association mapping on LG7 that accounted for 19 % of the variation (Soto-Cerda et al. 2014a). The STE QTL on LG1 contained genes for H-AT to facilitate fatty acid chain elongation whereas the SAD gene uses STE as a substrate to form OLE through the creation of a double bond at the $\Delta 9$ position, thereby affecting STE (Ohlrogge and Jaworski 1997). The STE QTL on LG3 encompassed genes for KASI and KASII involved in synthesis of PAL and STE, respectively, affecting the production of precursors. QTL for OLE on LG3 encompassed genes for fatty acid reductase which adds CoA to long-chain aldehydes to form long-chain acyl–CoA (Riendeau et al. 1982), FAD2 which converts OLE to LIO (Shanklin and Cahoon 1998), various acyl-transferases and acyl-activating enzymes also known as acyl–CoA synthetases (Conti et al. 1996). The QTL on LG5 harboured a gene for FAS which catalyzes de novo biosynthesis of fatty acids. Unlike animal FAS, a multi-subunit multifunctional protein, plant FAS is a dissociable multi-subunit complex consisting of enzymes such as KAS family, 3-ketoacyl–ACP reductase, 3-hydroxyacyl–ACP dehydrase and enoyl–ACP reductase (Ohlrogge and Jaworski 1997) which catalyzes



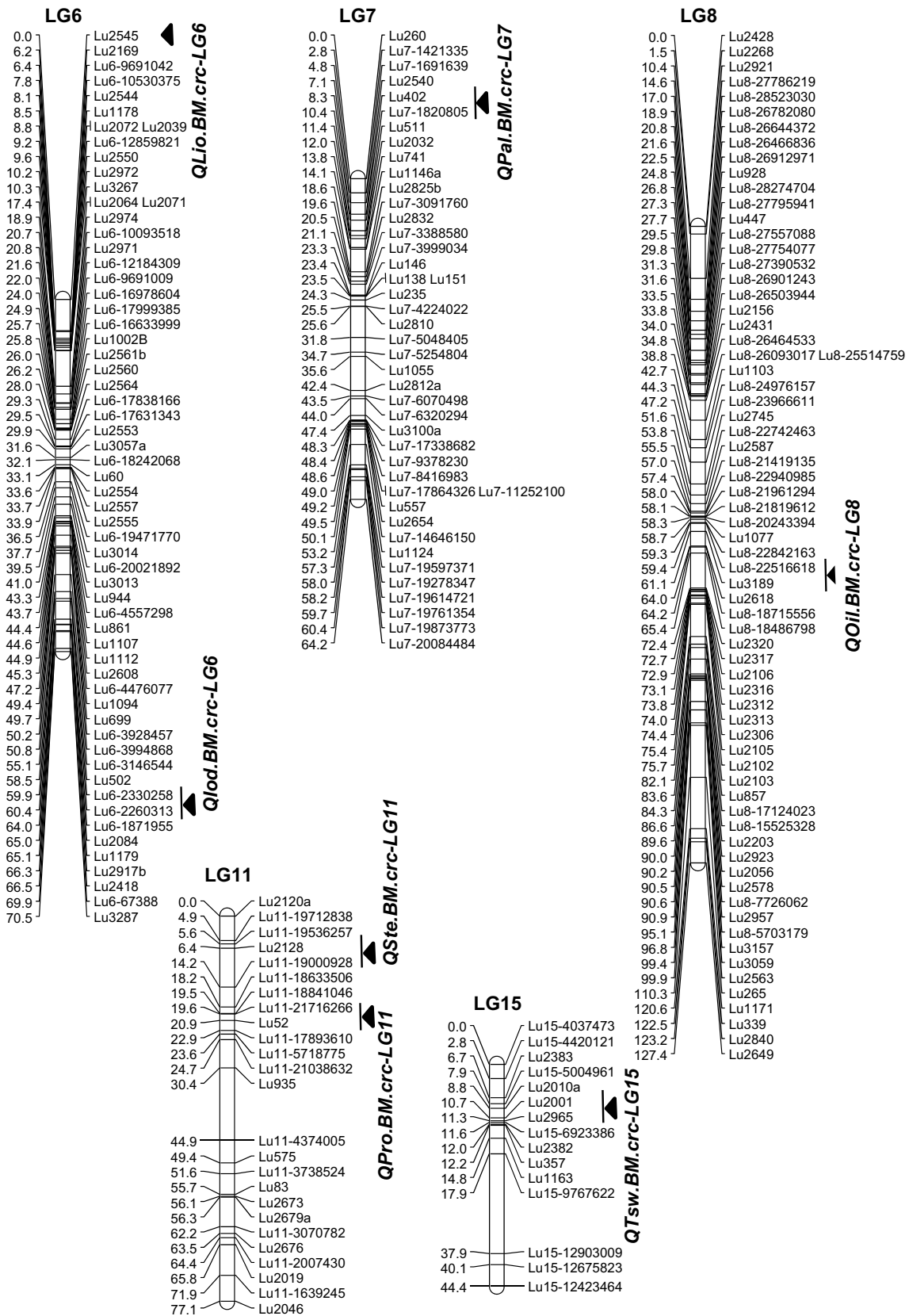


Fig. 2 continued

Table 6 Candidate genes discovered underlying the QTL identified for 14 traits

Trait ^a	LG	Marker interval	Size (cM)	Gene ^b	Gene ID	Encoded protein	
PAL	7	Lu402/Lu7-1820805	2	<i>KAS IIIb-2</i>	Lus10028925	3-ketoacyl-acyl carrier protein synthase III	
					Lus10028818	Flavin containing amine oxidoreductase family protein	
					Lus10028813	HXXXD-type acyl-transferase family protein	
STE	1	Lu2183a/Lu1-2670961	2.6	<i>SAD3-1</i>	Lus10018926	Steroyl-ACP desaturase	
					Lus10014695	HXXXD-type acyl-transferase family protein	
					Lus10003621	Long-chain fatty alcohol dehydrogenase family protein	
					Lus10003557	Myb domain protein	
STE	3	Lu3-8415336/Lu2164	4.1	<i>KAS Ib-1</i>	Lus10040883	3-ketoacyl-acyl carrier protein synthase I	
					Lus10029225	Myb-like HTH transcriptional regulator family protein	
					Lus10024747	Acetyl-CoA carboxylase 1	
				<i>mtKAS-1</i>	Lus10014622	3-ketoacyl-acyl carrier protein synthase II	
					Lus10019568	Alcohol dehydrogenase transcription factor Myb/SANT-like family protein	
STE	11	Lu2128/Lu11-19000928	7.8		Lus10019567	Lipase class family protein	
					Lus10039330	HXXXD-type acyl-transferase family protein	
					Lus10039316	Plastidic pyruvate kinase beta subunit	
OLE	3	Lu3-3979616/Lu3-5950394	12.9		Lus10039296	NADH-ubiquinone oxidoreductase-related	
					Lus10019187	Fatty acid reductase	
					Lus10019183	HXXXD-type acyl-transferase family protein	
					Lus10003470	Myb-like transcription factor family protein	
OLE	3	Lu658/Lu3150	2.6		Lus10003688	Acyl-CoA N-acyltransferases (NAT) superfamily protein	
					Lus10017154	Membrane bound O-acyl transferase (MBOAT) family protein	
					Lus10017096	Myb domain protein 108	
					Lus10017089	Fatty acid desaturase 2	
					Lus10017079	O-acetyltransferase family protein	
OLE	5	Lu5-9728492	0.2		Lus10037735	Acyl-activating enzyme 7	
					Lus10000592	HXXXD-type acyl-transferase family protein	
					Lus10006668	Acyl-CoA N-acyltransferases (NAT) superfamily protein	
					<i>KAS IIIa-2</i>	Lus10032246	3-ketoacyl-acyl carrier protein synthase III
						Lus10032323	Acyl-CoA N-acyltransferases (NAT) superfamily protein
					<i>KAS II-1</i>	Lus10034886	Fatty acid synthase 1
					<i>KCS10</i>	Lus10028105	3-ketoacyl-CoA synthase 10
<i>KCS12-3</i>	Lus10029880	3-ketoacyl-CoA synthase 7					
LIO	3	Lu3-3979616/Lu3-5950394	12.9		Lus10024036	Myb family transcription factor	
					Lus10019187	Fatty acid reductase	
					Lus10019183	HXXXD-type acyl-transferase family protein	
					Lus10037023	Oxidoreductase, 2OG-Fe(II) oxygenase family protein	
LIO	6	Lu2545	6.2	<i>KCS5-2</i>	Lus10003470	Myb-like transcription factor family protein	
					Lus10003688	Acyl-CoA N-acyltransferases (NAT) superfamily protein	
					Lus10012611	3-ketoacyl-CoA synthase 1	
					Lus10004809	Myb-like HTH transcriptional regulator family protein	
					Lus10004833	Glycerol-3-phosphate acyltransferase 6	

Table 6 continued

Trait ^a	LG	Marker interval	Size (cM)	Gene ^b	Gene ID	Encoded protein				
LIN	5	Lu5-9728492	0.2		Lus10000592	HXXXD-type acyl-transferase family protein				
					Lus10006668	Acyl-CoA N-acyltransferases (NAT) superfamily protein				
				<i>KAS IIIa-2</i>	Lus10032246	3-ketoacyl-acyl carrier protein synthase III				
					Lus10032323	Acyl-CoA N-acyltransferases (NAT) superfamily protein				
				<i>KAS II-1</i>	Lus10034886	Fatty acid synthase 1				
				<i>KCS10</i>	Lus10028105	3-ketoacyl-CoA synthase 10				
				<i>KCS12-3</i>	Lus10029880	3-ketoacyl-CoA synthase 7				
					Lus10024036	Myb family transcription factor				
				IOD	5	Lu5-9728492	0.2		Lus10000592	HXXXD-type acyl-transferase family protein
									Lus10006668	Acyl-CoA N-acyltransferases (NAT) superfamily protein
<i>KAS IIIa-2</i>	Lus10032246	3-ketoacyl-acyl carrier protein synthase III								
	Lus10032323	Acyl-CoA N-acyltransferases (NAT) superfamily protein								
<i>KAS II-1</i>	Lus10034886	Fatty acid synthase 1								
<i>KCS10</i>	Lus10028105	3-ketoacyl-CoA synthase 10								
<i>KCS12-3</i>	Lus10029880	3-ketoacyl-CoA synthase 7								
	Lus10024036	Myb family transcription factor								
IOD	6	Lu6-2330258/Lu6-2260313	0.6						Lus10017610	Plastidic glucose-6-phosphate translocator
									Lus10022222	UDP-Glycosyltransferase superfamily protein
OIL	8	Lu8-22516618/Lu3189	1.7		Lus10022219	Sec23/Sec24 transport family protein				
					Lus10022211	Ureidoglycolate amidohydrolase				
					Lus10022332	Glyceraldehyde-3-phosphate dehydrogenase C2				
					Lus10022308	NAD-dependent glycerol-3-phosphate dehydrogenase family protein				
					Lus10022302	Kunitz family trypsin and protease inhibitor protein				
					Lus10022292	Senescence-related gene				
					Lus10011062	Phospholipid/glycerol acyltransferase family protein				
				PRO	11	Lu11-21716266/Lu52	1.3		Lus10023623	Pectate lyase family protein
									Lus10023631	Late embryogenesis abundant (LEA) hydroxyproline-rich glycoprotein family
									Lus10019030	Bifunctional inhibitor/lipid-transfer protein/seed storage 2S albumin superfamily protein
	Lus10031300	Asparagine synthetase								
	Lus10031136	Zincin-like metalloproteases family protein								
	Lus10031129	Ribosomal protein S5/Elongation factor G/III/V family protein								
CW	4	Lu2031	0.7						Lus10036840	UDP-Glycosyltransferase superfamily protein
									Lus10036740	Haloacid dehalogenase-like hydrolase (HAD) superfamily protein
									Lus10036722	Zinc knuckle (CCHC-type) family protein
									Lus10015817	Remorin family protein
					Lus10034348	Core-2/I-branching beta-1,6-N-acetylglucosaminyltransferase family protein				
					Lus10034379	COBRA-like protein				
					Lus10034439	Laccase				
					Lus10041457	β-xylosidase				
					Lus10041481	Laccase/Diphenol oxidase family protein				
					Lus10041626	Nudix hydrolase homolog				

Table 6 continued

Trait ^a	LG	Marker interval	Size (cM)	Gene ^b	Gene ID	Encoded protein
SW	4	Lu2031	0.7		Lus10036914	Plasmodesmata callose-binding protein
					Lus10036773	NAC-like, activated by AP3/PI
					Lus10036721	Pectate lyase family protein
					Lus10015817	Remorin family protein
					Lus10015791	Exostosin family protein
					Lus10034379	COBRA-like protein precursor
YLD	4	Lu2031	0.7		Lus10036891	WRKY DNA-binding protein
					Lus10036824	Fatty acid reductase
					Lus10036819	HXXXD-type acyl-transferase family protein
					Lus10036773	NAC-like, activated by AP3/PI
					Lus10036761	AGAMOUS-like
					Lus10015760	TEOSINTE BRANCHED 1, cycloidea, PCF (TCP)-domain family protein 20
					Lus10041540	RGA like GRAS family transcription factor
					Lus10041457	β-xylosidase
DM	4	Lu2031	0.7		Lus10041511	Ferulic acid 5-hydroxylase
					Lus10041522	CCR-like; Lir1 Light regulated protein
					Lus10041535	Senescence-related gene
					Lus10041483	Phytochrome and flowering time regulatory protein (PFT1)
					Lus10036746	Phytochrome kinase substrate

The genes were identified using the CDC Bethune annotated sequence available at <http://phytozome.jgi.doe.gov/>

^a Traits as per Table 2

^b Genes involved in fatty acid synthesis (You et al. 2014)

synthesis of PAL. In addition, various acyl-transferases and a KASI gene were also identified on LG5, which may play a role in OLE in plants.

Cloutier et al. (2011) identified two QTL for LIO on LG7 and LG16 accounting for 34 and 20 % of the phenotypic variability in the doubled haploid population generated from a cross between SP2047 and UGG5-5. Soto-Cerda et al. (2014a) identified three QTL for LIO on LG3, LG5 and LG12 using association studies, one of which validated a previously identified QTL (Cloutier et al. 2011). In the current study, two QTL were identified for LIO on LG3 and LG6 accounting for 15 % of the total phenotypic variation but they differed from the QTL identified in the two studies mentioned above. This is not surprising because in the first instance, the cross between a low and a high linolenic acid line was more likely to identify major genes such as *fad2* and *fad3* (Cloutier et al. 2011) while in the second, the authors looked at a broad germplasm collection with variable allelic richness and LIN ranging from 2 to 65 % (Soto-Cerda et al. 2014a) contrasting with the present study using a bi-parental population between two conventional linseed varieties both with 55–57 % LIN. The lack of segregation of the major allele QTL was more likely to unravel minor allele QTL in the latter. Indeed, association mapping is considered more powerful from the

increased polymorphism point of view, potentially resulting in the identification of additional QTL. The limitation then becomes the availability of these alleles in the breeding germplasm. In QTL studies based on linkage mapping from bi-parental populations, there are only two alleles and the strength of the QTL identification depends in part on the size of the mapping populations and the number of polymorphic markers available. The current study is based on a bi-parental population of 243 RILs developed from two modern Canadian varieties and a genetic map consisting of 691 markers (SSRs and SNPs). Taken together, these attributes are more likely to facilitate the application of these QTL in Canadian germplasm.

In addition to the acyl-transferases identified for other fatty acids, candidate genes underlying these LIO QTL included genes for fatty acid reductase and KAS1 mainly involved in synthesis of PAL. Genes encoding Myb transcription factors on both LIO QTL suggest their involvement in regulating *fad2* genes that contain Myb interacting sites on their gene promoters (Peng and Weslake 2011; Thambugala and Cloutier 2014). In previous reports, QTL for LIN and LIO co-located (Cloutier et al. 2011; Soto-Cerda et al. 2014a), an observation that differs from our results where QTL for LIN and IOD were identified at the same location as a QTL for OLE on LG5, contributing

~10 and 12 % of phenotypic variation for LIN and IOD, respectively.

In dicot species like flax, seed reserve components usually consist of seed storage proteins and/or storage lipids such as waxes or triacylglycerols (TAGs) which are formed by esterification of fatty acids (PAL, STE, OLE, LIO and LIN) in a glycerol backbone. In addition to various fatty acid biosynthesis genes, a number of transcription factors, secretory and transporter proteins also regulate seed oil content (Baud and Lepiniec 2010). The QTL for seed oil encompassed genes such as UDP-glycosyltransferase which are highly expressed during the early stages of seed development in high oil lines of soybean (Wei et al. 2008). The genes for Kunitz family trypsin inhibitor protein as well as the senescence-related proteins accumulated more transcripts in high oil compared to low oil lines (Wei et al. 2008). A proteomic study in flax characterized 2S albumin (conlinin) and 11S globulin (legumin, glutenin type A, cupin) proteins (Barvkar et al. 2012). The seed protein QTL on LG11 had multiple copies of genes encoding seed storage proteins such as 2S albumin family protein, late embryogenesis abundant (LEA) proteins and glycoproteins (Table 6). In addition, we also detected 7S globulin (48 kDa glycoprotein precursor) protein. The 2S albumins are small (1.7–2.2S), sulphur-rich plant storage proteins synthesized and stored in developing seeds and act as a source of nutrients during subsequent germination and seedling growth (Boutillier et al. 1999). Flax contains two seed specific 2S albumins type proteins: conlinin1 and conlinin2 (Truksa et al. 2003). LEA proteins protect other proteins from aggregation during seed desiccation at maturity or osmotic stresses associated with low temperature (Goyal et al. 2005). Other proteins identified underlying the PRO QTL included the hydroxyproline-rich glycol-proteins which play a vital role in plant growth and development including stress tolerance (Showalter et al. 2010).

The identification of a number of genes that potentially affect the studied traits is a good start but additional gene expression data and fine-mapping of QTL will be required to pinpoint genes/markers affecting traits and to distinguish causal polymorphism(s). In addition, genes/markers validated by other QTL studies or association studies will provide greater confidence for their use in breeding.

Conclusions

The current study described the first high-density SSR-SNP map in linseed and identified QTL for important agronomic, fibre and seed specific traits. The evenly distributed map, use of RILs from a conventional cross and phenotypic data from eight environments for most of the traits assisted

in identification of major and minor QTL for fourteen traits that are important to the commercial success of flax. The availability of the sequenced genome of CDC Bethune, one of the parents of the population, allowed identification of several putative effector genes and transcription factors underlying the traits. Candidate genes based on known functionality related to the traits were discussed. This information combined with the resequencing data of the Canadian core collection of 407 accessions and its phenotypic assessment promise to bolster the efficiency of map-based cloning particularly for highly heritable and major QTL. Despite these resources, the definitive identification and validation of the functional unit(s) underlying QTL remain challenging considering that most QTL are not associated with structural changes in protein coding sequences. Nevertheless, the identification of marker Lu2031 tightly linked (0.7 cM) to a number of QTL regulating seed and straw yield as well as DM is an immediate outcome of the QTL mapping presented herein and it likely will be a valuable marker for breeding dual purpose flax.

Author contribution statement SC, SD, and GR designed the experiment. SD and HB produced the phenotypic data and SC, the genotypic data. FMY performed the SNP discovery analysis. SK performed data analysis and co-wrote the manuscript with SC.

Acknowledgments The authors are grateful to Gord Penner and Evelyn Loewen, the Cloutier lab members and the breeding teams at the Morden Research Station and the Crop Development Centre for technical assistance. We are grateful to Andrzej Walichnowski for his proofreading of the manuscript. This work was conducted as part of the Total Utilization Flax Genomics (TUFGEN) project funded by Genome Canada and co-funded by the Government of Manitoba, the Flax Council of Canada, the Saskatchewan Flax Development Commission, Agricultural Development Fund and the Manitoba Flax Growers Association. Project management and support by Genome Prairie are also gratefully acknowledged.

Conflict of interest The authors declare that they have no conflict of interest.

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