Clarifying sub-genomic positions of QTLs for flowering habit and fruit quality in U.S. strawberry (Fragaria × ananassa) breeding populations using pedigree-based QTL analysis

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The cultivated strawberry (Fragaria × ananassa) is consumed worldwide for its flavor and nutritional benefits. Genetic analysis of commercially important traits in strawberry are important for the development of breeding methods and tools for this species. Although several quantitative trait loci (QTL) have been previously detected for fruit quality and flowering traits using low-density genetic maps, clarity on the sub-genomic locations of these QTLs was missing. Recent discoveries in allo-octoploid strawberry genomics led to the development of the IStraw90 single-nucleotide polymorphism (SNP) array, enabling high-density genetic maps and finer resolution QTL analysis. In this study, breeder-specified traits were evaluated in the Eastern (Michigan) and Western (Oregon) United States for a common set of breeding populations during 2 years. Several QTLs were validated for soluble solids content (SSC), fruit weight (FWT), pH and titratable acidity (TA) using a pedigree-based QTL analysis approach. For fruit quality, a QTL for SSC on linkage group (LG) 6A, a QTL for FWT on LG 2BII, a QTL for pH on LG 4CI and two QTLs for TA on LGs 2A and 5B were detected. In addition, a large-effect QTL for flowering was detected at the distal end of LG 4A, coinciding with the FaPFRU locus. Marker haplotype analysis in the FaPFRU region indicated that the homozygous recessive genotype was highly predictive of seasonal flowering. SNP probes in the FaPFRU region may help facilitate marker-assisted selection for this trait.

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INTRODUCTION

The cultivated strawberry (Fragaria × ananassa Duch. ex Rozier) is widely consumed fresh or in processed form. Improved fruit quality is desired by consumers and sought by breeders.¹ Major components of fruit quality attributes include appearance, texture, taste, aroma and nutritional content.² The intense flavor of strawberry is characterized by high titratable acidity (TA), high soluble solids content (SSC) and strong aroma.³ Some progress toward selecting for aroma compounds and flavor has been made over the last few years.⁴⁻⁶ In addition to good taste, strawberries contain antioxidant and other nutritional compounds that may help reduce risk of some chronic ailments,⁵⁻⁷ and there has been substantial research aimed at identifying the genes involved in the biosynthetic pathways involved in the accumulation of these compounds.⁸⁻¹⁰

Cultivated strawberries are allo-octoploid (2n = 8 × 56) and mapping studies show major disomic inheritance.¹¹⁻¹³ In the last decade, numerous quantitative trait loci (QTLs) for strawberry fruit quality traits have been detected across diverse breeding material. Lercetue-Köhler et al.¹² pioneered QTL mapping in octoploid strawberry, detecting several QTLs for 19 fruit development and quality traits in a cross between ‘Capitola’ and the selection CF1116. Most of the QTLs explained 10⁻17% of the total phenotypic variation for the corresponding trait. Low genetic effects for fruit quality traits are expected as they are strongly influenced by environmental conditions.¹³ Zorrilla-Fontanesi et al.³,¹⁴ detected several QTLs for fruit quality traits and volatile compounds in a cross between the Spanish selections 232 and 1392. Castro and Lewers¹⁵ used 177 F₁ individuals from a cross between ‘Delmarvel’ and ‘Selva’ to conduct QTL analysis for fruit quality traits and identified QTLs in many of the same regions identified by Lercetue-Köhler et al.¹²

Flowering behavior is another important trait in strawberry plants and is strongly affected by temperature and photoperiod conditions.¹⁶⁻¹⁸ Strawberry plants are classified into seasonal flowering (SF also known as ‘short-day’ or ‘June-bearing’) or perpetual flowering (PF also known as ‘everbearing’, ‘day-neutral’ or ‘remontant’). SF plants typically initiate flower buds under photoperiods of < 14 h or at temperatures below 15 °C and usually have a shortened harvest period compared with PF plants.¹⁶⁻¹⁷ Conversely, PF strawberries can initiate flowering when temperatures are < 30 °C during the day all summer and into the autumn.¹⁹⁻²⁰ An extended harvest season is an attractive quality for a strawberry, particularly in the central coast of California and other summer production regions. Numerous sources of the PF trait have been identified in octoploid strawberry.¹⁹,²⁰,²¹ However, only the PF phenotype conferred by the FaPFRU locus from a F. virginiana subsp. glauca accession originating from the Wasatch Mountains in Utah has been studied in great detail.¹⁵,¹⁶,¹₈,₂₂⁻²⁷ This single dominant locus confers the ability to initiate flowers in
F. × ananassa under long days at permissive temperatures and is located on the F. vesca chromosome 4 homolog.\textsuperscript{15,16,22,23} Recently, Honjo \textit{et al.}\textsuperscript{28} conducted QTL analysis in three populations segregating for PF that were derived from three different PF cultivars. Two of the PF cultivars, ‘Summer-berry’ and ‘Ever-berry’, are cultivars classified as ‘older everbearers’ and are derived from an unknown Japanese PF source while ‘Hecker’ is a day-neutral cultivar developed at the UC Davis program with the \textit{FaPFRU} locus.\textsuperscript{21,28} A QTL located on chromosome 4 was detected in all three PF cultivars and a subsequent allelism test suggested the PF phenotype in the Japanese cultivars is controlled by a tightly linked gene or the same gene as that present at \textit{FaPFRU}.\textsuperscript{28} Salinas \textit{et al.}\textsuperscript{18} identified a diagnostic allele for the \textit{FaPFRU} locus in the PF Japanese cultivar Ooishi-shikinari 3, which is derived from the same source as ‘Ever-berry’, and suggested that the \textit{FaPFRU} locus may have been introgressed numerous times before its initial discovery by Bringhurst in 1955.

There were ambiguities in each sub-genome assignments of QTLs in the past and this study uses advanced molecular tools to refine and clarify those ambiguities. In each of the previous QTL studies, low-density genetic maps in bi-parental populations were used for QTL detection and sub-genome identification. These low-density maps often contained different marker types (amplified fragment length polymorphism and simple sequence repeats (SSRs)) and as a result, the studies are difficult to compare. In addition to that, in the past, QTLs were mostly assigned to a homeologous group (HG) rather than a specific sub-genome. Moreover, bi-parental populations often exhibit limited genetic diversity, resulting in only a few alleles within the germplasm being identified.\textsuperscript{29,30} To maximize gain of genetic information, a QTL analysis approach using multiparental pedigree-linked strawberry populations was developed\textsuperscript{29,30} and in conjunction with the Axiom IStraw90 SNP array\textsuperscript{11} has become a powerful tool for high-resolution QTL mapping.\textsuperscript{32,33} Using this pedigree-based QTL analysis (PBA) approach, implemented through FlexQTL, provides advantages over traditional bi-parental population methods, allowing for a QTL to be evaluated in numerous genetic backgrounds while simultaneously increasing the chances for recombination events near QTLs controlling traits of interest.\textsuperscript{29,30} The IStraw90 array\textsuperscript{31} allows for the high-throughput, repeatable genotyping necessary to produce a high-quality consensus map and clear sub-genome assignments. The genetic map used in this study follows sub-genome assignments from Koehorst-vanc Putten and van de Weg (2017, unpublished data), which clearly defines and separates octoploid strawberry sub-genomes. Individually, the bi-allelic single-nucleotide polymorphism (SNP) markers on the array provide limited information on the segregation of marker alleles via pedigrees because of potential homozygosity at these loci. However, when the markers are analyzed jointly, haplotypes useful for marker-assisted selection (MAS) can be identified.\textsuperscript{34}

PBA is especially attractive in clonally propagated plants as statistical power can be increased by phenotypically evaluating ancestral germplasm in the same environments as descendants.\textsuperscript{28} When using PBA, it is critical to use a dense map as low marker density can add ambiguity in the transfer of alleles through generations.\textsuperscript{35} FlexQTL implements a Bayesian statistical approach using pedigree-linked populations to improve statistical power and detect vertically inherited QTL alleles.\textsuperscript{29} Confirmation of accurate pedigree information is particularly important when utilizing PBA, and pedigree records from a breeding program must be checked for accuracy because of human error or pollen contamination.\textsuperscript{29,30} FlexQTL traces founder alleles to contemporary generation and if pedigree records entered incorrectly, it provides information on which pedigree records are associated with inconsistencies.

The objectives of this study were to further refine and clarify the sub-genomic locations of major fruit quality and flowering habit QTLs, to dissect the genetics controlling fruit quality and flowering in F. × ananassa using the Axiom IStraw90 SNP array for genotyping together with FlexQTL for QTL analysis of multi-parental pedigree-linked populations, and to compare the QTL results with previous studies. SNP haplotype analysis was applied to define the locus of a trait controlled by one strong and consistent QTL for PF detected by FlexQTL.

**MATERIALS AND METHODS**

**Breeding germplasm**

This study focused on breeding populations established in the RosBREED Project to represent the Michigan State University (MSU) and the USDA-ARS Horticultural Crops Research Unit (HCRU)-indicated by Oregon U.S. (ORUS)) strawberry breeding programs in Michigan (MI) and Oregon (OR), respectively.\textsuperscript{35} The pedigree-connected germplasm consisted of 23 F\textsubscript{3} families representing 11 important breeding parents from the two breeding programs and their 249 progeny, collectively (Supplementary Information S1). The 11 parents included the PF parents ‘Tribute’, ‘Fort Laramie’ and ‘Seascape’ and the SF ‘Earliglow’, ‘Honeoye’, ‘Puget Reliance’, ‘Tomet’ and selections, MSU 49 and MSU 56.

**Phenotypic data**

Phenotypic data for seven fruit quality traits were measured or scored in 2011 and 2012 in MI and OR according to Mathy \textit{et al.}\textsuperscript{35} and included: SSC (“Brix), fruit weight (FWT) (g per fruit), firmness (Firm; 1 (very soft) – 9 (very firm) scale), TA (g.l\textsuperscript{−1} citrus acid), ratio of SSC and TA (SSCTR), pH, flavor and external color (ExtCol). In addition to the fruit quality traits, the ability of an individual to perpetually flower (PF) was assessed as described by Mathy \textit{et al.}\textsuperscript{35} In this study, flowering was recorded as a binary trait, 0 for SF and 1 for PF, based on the presence of flowers on or after 17 July.\textsuperscript{35} Phenotyping at two locations and over 2 years allowed testing of genetic control of traits in different environments and years. Density plots were visualized for each trait. Spearman’s rank correlation coefficients (\(r\)) and \(P\) values were adjusted for multiple comparisons using the Bonferroni correction method for each trait over 2 years using R version 3.2.5.\textsuperscript{36}

**Genotyping and genetic map**

DNA from seedlings and parents was extracted from actively growing leaf tissue with the EZ-2 96 Plant DNA extraction kit (Omega BioTek, Norcross, GA, USA) as previously described.\textsuperscript{37} The resulting genomic DNA was quantitated with the Quanti-IT Picogreen Assay (Invitrogen, Eugene, OR, USA) according to the manufacturer’s recommendations using a Victor\textsuperscript{\textregistered} V 1420 Multilabel Counter (Perkin Elmer, Downers Grove, IL, USA). DNA concentrations were adjusted to 20–50 ng \(\mu\text{L}\)\textsuperscript{−1} and submitted to Affymetrix, Inc. (Santa Clara, CA, USA) for genotyping with the Axiom IStraw90 SNP array.\textsuperscript{31} Genotypic data acquired by Affymetrix, Inc. was recorded with GenomeStudioConverter\textsuperscript{38} to convert it into the software input file format needed for Pedimap version 1.2\textsuperscript{38} and FlexQTL version 099130.\textsuperscript{39} Genetic positions of 10 560 filtered \textit{PolyHighResolution} and \textit{NoMinorHomozygous} SNP markers identified in Bassil and Davis \textit{et al.}\textsuperscript{31} were obtained from a high-density SNP genetic map constructed using the ‘Holiday’ × ‘Korona’ population (Koehorst-vanc Putten and van de Weg, 2017, unpublished data). Sub-genome assignments and orientation of each linkage group (LG) was based on van Dijk \textit{et al.}\textsuperscript{39} The homozygous regions across parents were mapped using R software to identify genetic regions where lower QTL detection power would be expected.\textsuperscript{36}

**Pedigree confirmation**

Genotypic data were tested for pedigree relationships and marker inheritance errors using phased marker allele information from FlexQTL version 099130.\textsuperscript{29} Extensive checking of parentage records and marker calls were conducted using SNP marker data and a Microsoft Excel-based tool (van de Weg E, 2016, unpublished data). The Excel-based tool was utilized to identify and eliminate off-type individuals and to identify correct parentage. In general, marker genotypes were filtered for consistency of calls and incorrect pedigree records were corrected after validation. When genotypic data were not available for the parents, they were predicted with FlexQTL and the PediHaplotyper R package,\textsuperscript{36} and then used to confirm pedigree relationships.
QTL detection and haplotyping

Haploblock (HB) alleles\cite{29,38} were created using the R package \texttt{fp_haplo typer} (Roeland Voorrips, 2014, unpublished data) and 10,560 SNP markers, in order to save computation time. FlexQTL was used for genome-wide QTL analysis using HB alleles.\cite{29,34} LGs where significant QTLs were identified in at least two out of four location-years were reanalyzed with SNP markers using FlexQTL.\cite{32,40}–\cite{43} Phenotypic data of only unselected material (seedlings) were used for QTL analysis to prevent prediction biases. Parameter settings used for all FlexQTL runs followed Mangandi \textit{et al.}\cite{33} The Bayes factor parameter (2lnBF) was interpreted as nonsignificant (0–2), positive (2–5), strong (5–10) or decisive (> 10) evidence for the presence of QTLs. Genome-wide evidence was collected in support of QTL models ranging from 1 QTL versus 0 QTLs to \( n \) versus \( n-1 \) QTLs, where \( n \) is the number of QTLs detected in the model. MapChart version 2.34 and VisualFlexQTL version 0.1.0.42 were used to visualize FlexQTL output on traces of convergence of QTL models to identify the genomic regions associated with significant QTLs. Additional posterior inference analysis, using the postQTL module, was conducted to delineate significant and repeatable QTL regions in order to obtain the best posterior estimates of genotype probabilities, breeding values and weighted additive variances. The phenotypic variation explained by a QTL was estimated as PVE (%) = \( [(\text{probability} \times \text{AVt})/\text{Vp}] \times 100 \), where probability is the cumulative probability

\[ \text{Figure 1.} \] Density plots of FWT, pH, SSC and TA for MI and OR in 2011 and 2012 indicate that many of the trait measurements exhibited an approximately normal distribution density fit lines as indicated in black.
Assessment of EMFv006 marker for DNA informed breeding

The SSR marker EMFv006 was previously found to be associated with an SSC QTL on chromosome 6A.12 EMFv006 was assessed for potential use in MAS by genotyping these populations for which phenotypic data was also gathered. PCR was conducted using the Type-It Multiplex Microsatellite PCR Qiagen kit (Qiagen N.V., Venlo, The Netherlands) in a total volume of 15 μL. Each reaction consisted of 8.3 μL of 2X Type-it Multiplex PCR Master Mix, a fluorescently labeled forward primer and reverse primer each at a final concentration of 0.025 μM, 1.7 μL of Q-solution and 3.3 μL of 3 ng–1 DNA. Amplification was performed in a PTC-225 Thermal Cycler (MJ Research, Inc., Waltham, MA, U.S.A.) using a touch-down program that consisted of an initial denaturation of 95 °C for 5 min; 10 cycles of 95 °C for 30 s; 62 °C for 1.5 min decreasing by 1 °C per cycle; and 72 °C for 30 s; and a final extension at 60 °C for 30 min. The PCR products were kept at 4 °C until removed from the thermocycler. PCR success was assessed by 2% agarose gel electrophoresis. Allele composition for this SSR marker was determined for each individual after separation of PCR products by capillary electrophoresis with a Beckman CEQ 8000 (Beckman Coulter, Inc., Pasadena, CA, USA). Beckman CEQ 8000 genetic analysis system software v 8.0.52 was used for allele visualization and scoring.

Assessment of HB markers for MAS

SNP markers covering the QTL confidence interval region were chosen for haplotyping. Phased haplotype information was obtained for each individual from the FlexQTL output and the number of individuals represented by haplotypes and diplotype by each of the 15 SNP markers was calculated using Excel. Haploview version 4.245 was used to identify recombination hotspots and HBs within the significant QTL regions that were detected in multiple location-years. PedIHaIptotyper R package39 was used to haplotype significant QTL regions. Flanking sequences of the SNP markers in the QTL region of FaPFRU were BLAST searched against the NCBI nucleotide database and the scaffolds of the F. vesca v1.0 genome assembly46 to confirm marker groupings. SNP markers and SSRs associated with FaPFRU were physically mapped to the identified F. vesca scaffolds using Bowtie2 version 2.2.947 and SAMtools version 1.3.1,48 and visualized using the Integrative Genomics Viewer version 2.3.28.49,50 Contingency tables were constructed for each of the haplotypes using different diagnostic interpretations of the genotypic data. The summary statistics of accuracy, the positive predictive value, the negative predictive value, sensitivity, specificity and the adjusted diagnostic odds ratio were calculated for each test interpretation and the best interpretation for MAS was identified.18,51,52

RESULTS

Phenotypic data

The phenotypic distribution of many of the fruit quality traits approached normal distributions (Figure 1, Supplementary Figure S1). Mean FWT observed in OR in 2011 and 2012 (16.9 and 9.4 g) was higher than mean FWT observed in MI in 2011 and 2012 (5.4 and 7.8 g; Supplementary Table S1). The lowest FWT was observed in OR in 2011 and 2012 (5.4 and 7.8 g; Supplementary Table S1). The lowest FWT was observed in MI in 2011 (0.5 g) and the highest FWT was observed in OR in 2011 and 2012 (11.4 and 10.3 °Brix) compared with the mean SSC observed in OR in 2011 and 2012 (8.3 and 7.1 °Brix). Higher mean TA was observed in OR in 2011 and 2012 (9.9 and 1.1 g L−1 citric acid) compared with the mean TA observed in OR in 2011 and 2012 (0.81 and 0.69 g L−1 citric acid). Higher mean pH was observed in MI in 2011 and 2012 (8.3 and 4.5) compared with the mean pH observed in OR in 2011 and 2012 (3.4 and 3.3; Supplementary Table S1). Significant Spearman’s rank correlation coefficients (α = 0.05) were observed for PF within a location across years and between locations within 2011 and 2012. Most of the correlations were not significant (α = 0.05), however, significant negative correlation coefficients (r) were observed between TA and pH and significant positive correlations were observed for TA between locations (Supplementary Fig. S2).

Pedigree confirmation and correction

Of the 23 MSU and ORUS families included in this study, genotypic data of most offspring matched the reported parents in 14 families, matched one of the parents in nine families (MSU 9–18, ORUS 3279, ORUS 3305, ORUS 3315, ORUS 3316, ORUS 3320, ORUS 3324, ORUS 3325 and ORUS 3326), and did not match either parent in one family (ORUS 3324) when using the Excel-based tool (Supplementary Information S1). Two genotypes of ‘Fort Laramie’ were predicted based on offspring genotypes where ‘Fort Laramie’ is the parent of MSU 9–8, MSU 9–9, MSU 9–10 and ORUS 9–11 and ‘Fort Laramie 2’ is the parent of ORUS 3315, ORUS 3316 and ORUS 3324. An unknown pollen parent of MSU 9–18, which was supposed to be ‘Fort Laramie’, was also identified and is being referred to as father (F) of MSU 9–18. Two genotypes of ‘Puget Reliance’ were also predicted based on offspring genotypes where ‘Puget Reliance’ was the parent of ORUS 3315 and ORUS 3323, and ‘Puget Reliance 2’ was the parent of ORUS 3326. The SNP marker FaPFRU was previously included in this study did not match that of offspring ORUS 3305, ORUS 3324 or ORUS 3325. The SNP genotypes of ‘Sarian’ and ORUS 2427–1 did not match that of their offspring in one population for each parent, ORUS 3320 for ‘Sarian’ and ORUS 3279 for ORUS 2427–1. After correcting the pedigree records of the 23 families, seven offspring were identified that did not match either parent’s genotype. These seven offspring were removed from further analysis (Supplementary Information S1).

QTL analysis

A total of 28 LGs were constructed with varying number of sub-genomes (Supplementary Table S2). The length of the whole genome was 19.1 Morgans and LG 6C was the longest of all the groups extending to 128.7 cm; LG 5BII had the lowest number of markers, 14, and LG 6A had the largest number of markers, 677. The largest gap in the genetic map was of 24.5 cm on LG 7A (Supplementary Table S2). Polymorphic markers were well distributed among LGs and minor allele frequency ranged from 0 to 0.5 (Supplementary Figure S3).

QTLs for only four (SSC, FWT, pH and TA) out of the eight fruit quality traits were significant (Table 1; Supplementary Figures S4–S7). No QTLs were identified for fruit firmness (FIRM), ratio of SSC and TA (SSC/TA), flavor TA external color (ExtColor). One moderate effect QTL for SSC was detected in the OR 2012 season on LG 6A and explained 10% of the total phenotypic variation (Table 1; Supplementary Figure S4). A minor effect QTL (2lnBF < 5) for FWT was detected on LG 2BI in the OR 2011 environment (Supplementary Figure S5). For pH, a major effect QTL was detected on LG 4CII (MI 2012; Table 1; Supplementary Figure S6), which explained 20% of the phenotypic variation. One moderate effect (5 ≤ 2lnBF < 10) TA QTL was detected on LG 2A in MI 2011 and a minor effect QTL for TA was detected on LG 5B in OR 2012 (Table 1; Supplementary Figure S7). The moderate effect TA QTLs on LG 2A explained 8% of the total phenotypic variation and the one on LG 5B explained 22% of the total phenotypic variation.

A single major effect QTL for PF was detected by genome-wide QTL analysis of haplotype block alleles (Table 1; Supplementary Figure S8) across both locations (MI and OR) and years (2011 and 2012). The PF QTL explained 68% and 33% of the total phenotypic variation in 2011 and 2012, respectively, at both locations and was detected on the distal end of LG 4A between 44.7 and 50.2 cm using SNP markers (Figure 2). Based on the founders used in this study, this QTL likely corresponds to the FaPFRU locus.18,23,24

To confirm co-location of the PF QTL with FaPFRU, the sequences of 15 SNP markers associated with the QTL, and six additional SNP markers that were not used for the QTL analysis because they were either monomorphic or not high-quality markers within the QTL
Table 1. Summary of QTLs detected in the 25 pedigree-linked strawberry (Fragaria × ananassa) populations phenotyped in Michigan and Oregon in 2011 and 2012

|        | OR 2011 | OR 2012 |
|--------|---------|---------|
|        | LGs     | 2lnBF   | Interval (cM) | PVE (%) | LGs | 2lnBF   | Interval (cM) | PVE (%) |
| SSC    | —       | —       | —             | 6A       | 6   | 50–58   | 10            |
| FWT    | 2Bl1    | 4       | 0–5           | 9        | —   | —       | —             |
| pH     | —       | —       | —             | 5B       | 5   | 1–4     | 10            |
| TA     | —       | —       | —             | 5         | 5   | 29–33   | 12            |
| PF     | 4A      | 31      | 46–51         | 68       | 4A  | 31      | 47–50         | 33       |

MI 2011 MI 2012

- SSC: Soluble solids content; FWT: Fruit weight; pH: Titratable acidity; TA: Titratable acidity; PF: Perpetual flowering.
- PVE (%): Percentage of variance explained.
- BF: Bayes factor.

Abbreviations: FWT, fruit weight; MI, Michigan; LG, linkage group; OR, Oregon; PVE, phenotypic variation explained; SSC, soluble solids content; TA, titratable acidity; PF, perpetual flowering. Bayes factors ≥ 5 are highlighted as bold and Bayes factors ≤ 5 are italicized.

Figure 2. Posterior probability of PF QTL positions and traces of the QTL models along LG 4A for an additive genetic model. (a) Traces of number of QTL models: each black dot represents an independent QTL model and the consistent vertical line of black dots at the end of the chromosome indicates presence and location of the QTL. (b) Posterior probability of QTL positions, BF = Bayes factor. BF > 25 is confirmation of a decisive evidence of presence of a QTL.

Assessment of EMFv006 marker for DNA informed breeding

The SSR marker EMFv006 linked to the 6A SSC QTL was used to screen the RosBREED strawberry population set. The SSR marker amplified five different alleles: 207bp, 209bp, 213bp, 215bp and 217bp. These five marker alleles constituted 12 different genotypes and phenotypic data were available for nine marker genotypes. Phenotypic distribution associated with each of the nine diplotypes were visualized by density plots and no clear separation of density curves were observed (Supplementary Figure S9).

Figure 5). At the same time, phenotypic distribution associated with FlexQTL assigned QQ, Qq, qq diplootypes were also visualized and we observed separation in phenotypic distributions associated with QQ and qq with at least 50% overlapping region of the distributions (Supplementary Figure S9). This indicated that there might be significant association at the SNP level at the SSC locus on LG 6A. An analysis of variance model using these three QTL diplotypes (QQ, Qq, qq) explained approximately 20% of the total SSC variation within the strawberry breeding sets evaluated in OR 2012. However, when genetic screening of the RosBREED material was conducted with the SSR marker EMFv006, substantial homozygosity was observed. Further, high-resolution melting curve assay was performed to detect any sequence difference between the SSR marker EMFv006 homozygous alleles; however, no differences were detected. Therefore, EMFv006 was found to not be useful for MAS.

Assessment of FaPFRU locus HBs and haplotypes for MAS

Four HBs extending across the 15 SNPs associated with PF were identified within the germplasm using Haploview (Figures 3 and 4). A complex pattern of association of each of the 15 SNP marker emerged with each SNP marker within the QTL region having some level of predictive ability. Among the 15 SNPs associated with PF, 10 had relatively higher predictability for SF (negative predictive value > 0.95; Supplementary Figure S10). Individuals containing the BB diplotype for each of the 10 SNP markers were associated with SF, with a negative predictive value from 0.96 to 0.99. The three SNPs (AX-89790446, AX-89790447 and AX-89888142) within HB-2 were in high linkage disequilibrium (LD) with each other (Figure 4), and were predictive to SF, each with negative predictive values of 0.99. Of the seven remaining predictive SNP markers, the AA diplotype of AX-89831000, AX-89790608 and AX-89888381 and the BB diplotype of AX-89888339, AX-89831216, AX-89852507 and AX-89848625 were predictive for SF, with negative predictive values of at least 0.96 (Supplementary Fig. S10).

The three SNP markers of HB-2 were used jointly to haplotype the 249 seedlings and 11 parents from the 23 MSU and ORUS pedigree-linked populations. As these three SNP markers were high LD, haplotype diversity was low. Four haplotypes were segregating in the unselected material, only four diplotypes (compound haplotype) were possible: AAA|AAA (4%), AAA|BBB (35%), BBB|BBB (45%) and BBB|BBB (45%).

The homozygous diplotype BBB|BBB was most predictive for SF as demonstrated by higher negative predictive values over positive predictive values in each environment (Figure 5; Table 2) and was most predictive of SF in OR 2012. Heterozygous and homozygous individuals carrying the AAA haplotype expressed mixed flowering behavior. The cultivars Fort Laramie, Seascape, Tribute and Fort Laramie 2 were heterozygous at the FaPFRU locus and SF, whereas ‘Earliglow’, ‘Totem’, ‘Honeoye’, ORUS 2427-1, ‘Mary’s Peak’, MSU 49 and MSU 56 were homozygous BBB|BBB and SF. Environmental variability appears to affect the diagnostic accuracy of HB-2, which ranged from 64 to 80.7% (Table 2).
DISCUSSION

In this study, numerous QTLs were identified for horticulturally important traits. Many of the QTLs identified using the PBA approach were also identified in other studies using the pseudo test cross strategy, demonstrating this new methodology performs as good as previously established QTL analysis methods for strawberry. The PBA approach allowed for the QTLs to be evaluated in numerous genetic backgrounds, illustrating robust genotype-trait associations. In this study, we were able to clarify and pinpoint sub-genomic locations of QTLs. Moreover, the use of the 90K axiom array in the present study has allowed for the identification of significant QTLs with much higher resolution than in previous studies.

Correct pedigree information is critical for the PBA approach used and extreme care was taken to ensure correct pedigree information before conducting the QTL analysis. The power to detect a QTL using a PBA approach is affected by the frequency of the founder alleles in the population and is assessed via average allele representation (AAR). An AAR of 12.5 results in a 77.0%, 95.7%, 98.5% and 99.6% probability that each alternative allele is present at least 10, 8, 7 and 6 times in the population, respectively. An AAR of 12.5 units is recommended as the minimum for statistical power in representing the alleles of breeding parents. A minimum AAR of 12.5 can be achieved either by 23 progeny (0.5 × 23 = 11.5 AAR) and two parents (0.5 × 2 = 1AAR) or by 25 progeny (0.5 × 25 = 12.5 AAR) with unknown
There are other possibilities because of pedigree connections that can increase AAR because of relatedness as detailed by Peace et al. The AAR for the parents ORUS 2427-1, ‘Puget Reliance’ and ‘Totem’ was below the recommended threshold because of low numbers of true seedlings as compared with the rest of the parents. However, the alleles of the PF cultivars Seascape, Tribute and both genotypes of Fort Laramie, as well as the SF cultivar Earliglow, Honeoye, MSU 49 and MSU 56 were well represented with an AAR ranging between 12.5 in MSU 56 and 51.5 in ‘Tribute’ (Supplementary Information S1).

Although only minor (2lnBF < 5) and moderate (5 ≤ 2lnBF < 10) QTLs were detected for four fruit quality traits, one major effect (2lnBF ≥ 10) QTL was detected for flowering habit. The moderate effect QTL for SSC detected on LG 6A is supportive of the SSC QTLs on LGs associated with chromosome 6 previously reported in QTL studies conducted in the cultivated strawberry thus far.3,12,16 However, owing to the low mapping densities and the type of markers used in previous studies, it is not clear that these previously reported QTLs belong to LG 6A or to homoeologous chromosomes. The remaining five fruit quality QTLs identified in this study coincided with QTLs reported by at least one other study for the same trait on the same HG chromosome. The FWT QTL we detected on LG 2BII was also observed on HG 2 by Lerceteau-Köhler et al.12 The pH QTL detected on LG 4CII in MI 2012 was also previously reported on HG 4, by Lerceteau-Köhler et al.12 and Zorrilla-Fontanesi et al.3 As with the SSC QTL on LG 6A, however, it cannot be confirmed that the other fruit quality QTLs reported here are in the same regions found in the earlier studies.

The SSC QTL on LG 6A explained 10% of total SSC variation in the breeding populations evaluated in OR 2012. The SSR marker EMFv006, which was previously reported by Lerceteau-Köhler et al.12 to be closely associated with the SSC QTL, was also found flanking the current SSC QTL (van de Weg E, unpublished data). The SSR marker EMFv006 alleles were not able to differentiate between QTL alleles assigned by FlexQTL and was rendered not suitable for MAB applications. To determine if unknown polymorphism existed within the SSR marker EMFv006, analysis by high-resolution melting and amplicon sequencing was performed and no polymorphism associated with SSC level was determined, supporting ineffectiveness of EMFv006 marker for MAS.

Figure 5. Association of diplotypes (three SNP markers in HB-2) with PF and SF octoploid strawberry (Fragaria × ananassa) in MI and OR over 2 years in (a) MI 2011, (b) MI 2012, (c) OR 2011 and (d) OR 2012.

Table 2. Summary statistics of the diagnostic ability of HB-2 in four environments

| Environment | N   | P value     | Accuracy (%) | Positive predictive value (PF) | Negative predictive value (SF) | Sensitivity | Specificity |
|-------------|-----|-------------|--------------|---------------------------------|---------------------------------|-------------|-------------|
| MI 2011     | 212 | < 2.2E-16   | 80.7         | 0.77                            | 0.85                            | 0.86        | 0.76        |
| MI 2012     | 222 | 3.2E-07     | 64.0         | 0.45                            | 0.88                            | 0.82        | 0.56        |
| OR 2011     | 217 | 0.0297      | 69.6         | 0.53                            | 0.9                             | 0.86        | 0.61        |
| OR 2012     | 227 | 1.3E-14     | 70.5         | 0.47                            | 0.99                            | 0.98        | 0.6         |

Abbreviations: HB, haploblock; PF, perpetual flowering; MI, Michigan; OR, Oregon; SF, seasonal flowering. The diagnostic test was interpreted as predicting SF if the diplotype is BBB|BBB. Diplotype association with flowering habit was assessed using Pearson’s chi-squared test of independence with Yates’s correction.
consistent across locations and years and this unbalanced representation of the phenotypic data might have hindered detection of fruit quality QTLs across locations and over years. In addition, many fruit quality traits have been shown to be quantitatively inherited and under large environmental influence.\textsuperscript{12–15} Environmental influences may have prevented the detection of some smaller effect QTLs, although QTLs may not have been detected because of two sources of ascertainment bias that are present in this study. First, regions of low mapping resolution will exist in areas of the ‘Holiday’ x ‘Korona’ map where both parents were homozygous. As genetic positions from the ‘Holiday’ x ‘Korona’ map were used for our analysis, this source of lower mapping resolution was transferred to this experiment. Second, artificial regions of homozygosity may have been created in the parents because of using only markers that are polymorphic in the ‘Holiday’ x ‘Korona’ population but not in the parental germplasm. In all likelihood, unobserved markers exist that are polymorphic between parental lines in these regions that could aid in the detection of QTLs, as well as assist in the phasing of alleles.

As many of the cultivars used in previous PF studies share ancestry with those used in this study, the major effect QTL for PF detected at the distal end of LG 4A is likely the FaPFRU locus.\textsuperscript{11,15,16,18,23,24,26,27} This is further supported by the mapping of all 21 SNP markers within the QTL region to \textit{F. vesca} scaffold 051315B.\textsuperscript{28} High LD between SNP markers within HB-2 of the PF QTL region indicated co-inheritance of SNP marker haplotypes. HB-2 was approximately 1.5 Mb away from the FaPFRU locus and had significant association with flowering habit, with diplotype BBB|BBB being highly predictive of SF. Despite being highly associated with flowering, test accuracy varied among environments, ranging from 64 to 80.7%.

The genetic system that enables PF appears to be complex and likely constitutes several key genes and proteins that are capable of sensing environmental cues and hormone levels, which affect their function.\textsuperscript{29} This was reflected in the lack of clear 1:1 association of the putatively dominant AAA allele with PF in all families (Supplementary Table S3). We propose two possible reasons for this lack of clear association: (1) environmental conditions suppressed the expression of flowering related genes, and (2) the contribution of founder alleles whereby a recombination event or independent mutational events have caused the AAA haplotype to be linked in coupling to SF. OR and MI have very different environments, and fluctuations in temperature were an everyday phenomenon within these areas during the study period. Seasonal cues like temperature, light conditions and day length have a significant role in the floral transition leading to PF in strawberry.\textsuperscript{5,56} In addition, age-dependent vernalization also influences flowering.\textsuperscript{37} Perrotte and Gaston et al.\textsuperscript{24} and Salinas et al.\textsuperscript{18} identified SF cultivars, such as Earlglow and Elsaanta, which had the diagnostic allele of Bx215 for PF demonstrating that recombination or mutational events have occurred in the region. As the SNP markers from HB-2 are physically more distant than Bx215 from FaPFRU, it is not unexpected for one of these events to have occurred.

In conclusion, by using multiple pedigrees, PBA determines the effect of alleles from multiple founders simultaneously. Ten QTLs combined were detected for fruit quality traits in MI and OR over 2 years and a major effect QTL was detected for flowering habit in all environments. The flowering QTL was detected in the same genomic region as that of FaPFRU. A haplotyping approach applied to the SNPs within the FaPFRU allowed us to achieve greater concordance with the flowering habits of germplasm in different environments. Alleles predictive of SF were identified and can be converted to a breeder-friendly DNA test to distinguish flowering habits in the cultivated strawberry. Future work will include further dissection of the genetic regions identified in order to better understand the molecular mechanisms driving these traits. This work will ultimately help breeders identify cultivars with desired traits and provide information to develop DNA-based markers for MAS.

**CONFLICT OF INTEREST**

The authors declare no conflict of interest.

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