Research Paper

Construction of a high-density genetic map and identification of QTLs for cucumber mosaic virus resistance in pepper (*Capsicum annuum* L.) using specific length amplified fragment sequencing (SLAF-seq)

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Pepper (*Capsicum*) is one of the most important vegetable and spice crops. Aphid-transmitted cucumber mosaic virus (CMV) causes significant damage to pepper crops across the world. The genetic basis of CMV resistance in pepper is complex, and the mechanisms underlying resistance remain largely unknown. Here, we employed a SLAF-seq approach to generate a high-density genetic map of pepper. The map spanned 1,785.46 cM, containing 12,727 markers on 12 chromosomes, with a mean marker distance of 0.16 cM between adjacent markers. We used this map and the interval mapping (IM) and multiple QTL mapping (MQM) procedures to detect genetic regions associated with quantitative trait for CMV resistance. Three QTLs, *qcmv11.1, qcmv11.2* and *qcmv12.1*, conferred resistance to CMV and showed trait variation of 10.2%, 19.2% and 7.3% respectively. Our results will help to develop markers linked to CMV-resistant QTLs to improve pepper resistance to CMV.

Key Words: pepper, SLAF-seq, genetic map, cucumber mosaic virus, QTL.

Introduction

Pepper (*Capsicum*) is an important vegetable and spice crop, with 34.6 million tons fresh fruit and 3.5 million tons dried pods harvested from 3.9 million hectares across the world in the year 2011 (Food and Agriculture Organization, www.fao.org). Viral diseases often threaten pepper production, and the aphid-transmitted cucumber mosaic virus (CMV) is the most common viral diseases (Kang *et al.* 2010). CMV can cause severe systemic mosaic symptoms including leaf distortion and fruit lesion, and can dramatically reduce the marketable yield of pepper (Chaim *et al.* 2001, Palukaitis *et al.* 1992). Therefore, developing CMV resistant lines will help prevent crop damage and loss.

Most of the genetic mapping studies of CMV resistance in pepper plants suggest that the trait is controlled by multiple loci, and different sources exhibit different inheritable models of resistance to CMV (Grube *et al.* 2000, Suzuki *et al.* 2003). QTLs studies of CMV resistance have identified a varying number major and minor of QTLs in *C. annuum* cv. 'Perennial' (Caranta *et al.* 1997), and two major and several

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minor QTLs in C. annuum line 'BJ0747-1-3-1-1' (Yao et al. 2013). Recent studies have identified specific genic regions conferring CMV resistance, such as cmvP1-5.1 and cmvP1-10.1 in CMV_{P1}-resistant C. annuum line 'A1' (Min et al. 2016), qCmr2.1 and qCmr11.1 in C. frutescens cv. PBC688 (Guo et al. 2016). Additionally, a single dominant gene Cmr1 on the second chromosome was found to confer resistance against CMV_{Korean} and CMV_{FNY} strains in the C. annuum cultivar 'Bukang' (Kang et al. 2010). Taking results of genetic mapping of CMV resistance in pepper from various groups suggest that CMV resistance is a complex genetic trait (Yao et al. 2013). However, only a few linked markers have been tied to CMV resistance, which is caused by the low coverage of the linkage markers, leading to QTLs that cover large chromosomal regions. Therefore, a high-density genetic linkage map is likely to significantly improve the chances of QTL fine mapping.

The advances of next-generation sequencing (NGS) technologies by whole-genome resequencing (WGRS), restriction site-associated DNA sequencing (RAD-seq) (Baird *et al.* 2008), genotyping-by-sequencing (GBS) (Baird *et al.* 2008, Poland *et al.* 2012) and sequence-based genotyping (SBG) (Truong *et al.* 2012) have provided unprecedented means to identify a large number of genetic markers throughout the genome to construct high-density genetic maps. Similar to other methods that have been developed for increasing high-throughput SNP discovery, specific

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length amplified fragment sequencing (SLAF-seq), which discovers de novo SNPs using high-throughput sequencing (Sun *et al.* 2013), has been successfully applied to create high-density genetic maps in several plant species, including sesame (Zhang *et al.* 2013), cucumber (Wei *et al.* 2014, Xu *et al.* 2014), soybean (Li *et al.* 2014, Qi *et al.* 2014, Zhang *et al.* 2016a) and wax gourd (Jiang *et al.* 2015).

In a previous study, F_2 and back-cross populations derived from a cross between *C. annuum* inbred line 'BJ0747-1-3-1-1' (resistant female parent) and *C. annuum* inbred line 'XJ0630-2-1-2-1-1' (susceptible male parent) were used to identify QTLs for CMV resistance (Yao *et al.* 2013) using a low-density genetic map, therefore the QTLs were localized to large chromosomal regions. Here, we employed a SLAFseq approach to generate a high-density genetic map using the same population as Yao *et al.* (2013) to refine and discover QTLs for CMV resistance, and aid molecular markerassisted (MAS) breeding to improve pepper crop quality.

Materials and Methods

Mapping population and DNA extraction

Pepper inbred line 'BJ0747-1-3-1-1' ('BJ0747' for short) was previously identified as CMV-resistant (Yao *et al.* 2013). 'XJ0630-2-1-2-1-1' ('XJ0630' for short) is a CMV-susceptible inbred line. The resistant line 'BJ0747' and the susceptible line 'XJ0630' were crossed to generate F_1 off-spring, which were then self-pollinated to generate F_2 with a segregating population of 195 individuals. Each F_2 was self-pollinated to generate $F_{2:3}$ families.

Young leaves from the two parental lines and the 195 F_2 progeny were collected, and genomic DNA was extracted by a modified CTAB method (Murray and Thompson 1980). DNA was quantified using a Micro-Spectrophotometer (K5500, KaiAo, Beijing, China), and quality of total DNA was verified by agarose gels electrophoresis with a lambda DNA standard (GelDoc XR System, Bio-Rad, USA).

Virus strain, inoculation methods and phenotypic evaluation

The CMV_{HB-jz} strain, which was isolated from a major pepper production area in Jingzhou City, Hubei Province, was gifted by Dr. Li Cai (College of Plant Science & Technology of Huazhong Agricultural University). CMVinoculation was performed as previously (Yao *et al.* 2013) with modifications. 0.5 g leaves of CMV infected Nicotiana tabacum cv. Samsun NN were ground in 5 mL of 0.1 M phosphate buffer (pH 7.2) to prepare the inoculums. Pepper seedlings at the four true leaf stage were dusted with 600mesh carborundum, and inoculated with CMV by rubbing the leaves with inoculums. After inoculation, pepper seedlings were kept in a plastic house maintained at 25 to 30°C under fluorescent lighting (14 h light/10 h dark cycle, 200 µmol/m²/s, 70% relative humidity). CMV symptoms were observed two weeks after inoculation. Each plant was examined visually and assigned a disease grade according to the severity of mosaic and leaf distortion on a scale of 0 to 9 based on previously published methods (Yao *et al.* 2013). Disease indices of a population were calculated from disease grades of individual plants within a population using the following equation: disease indices (DIs) = (\sum (Number of plants in the disease grade × Disease grade)/ (9 × Total number of plants) × 100.

 F_2 lines were evaluated for resistance using selfed $F_{2:3}$ families. The parental lines and their F_1 were used as a control for phenotypic evaluation. For this, $F_{2:3}$ families, the parental lines and the F_1 were arranged in a randomized complete block design with two replicates, and each replicate had 10 plants. Disease indices from the $F_{2:3}$ families were used to represent the phenotypic values of individual F_2 lines in the linkage analysis.

SLAF library construction and high throughput sequencing

The SLAF library was constructed following Sun et al. (2013). The pepper reference genome (C. annuum var. CM334 v1.55, http://peppergenome.snu.ac.kr/download. php) (Kim et al. 2014) was used to design pre-restriction enzyme digestion based on the genome size and GC (guanine-cytosine) content information. Hae III restriction enzymes were chosen to digest genomic DNA of the parents and mapping population. After digestion by Hae III, fragments (SLAFs) ranging from 314 to 444 bp (with indexes and adaptors) were recovered and purified using a Gel Extraction Kit (50T, Qiagen, Suzhou, China). Gel-purified products were then diluted for pair-end sequencing using an Illumina HiSeq 2500 system (Illumina, Inc; San Diego, CA, USA) at Biomarker Technologies Corporation in Beijing (http://www.biomarker.com.cn/). Real-time monitoring was performed for each cycle during sequencing, the ratio of high quality reads with quality scores greater than Q30 (means a quality score of 30, indicating a 1% chance of an error, and thus 99% confidence) in the raw reads and guanine-cytosine (GC) content were calculated for quality control (Zhang et al. 2013).

SLAF-seq data analysis and genotyping

Analysis of SLAF-seq data was described as Sun *et al.* (2013), as following. Raw reads were sorted to each progeny according to duplex barcode sequences. After the barcodes and the terminal 5-bp positions were trimmed, high-quality reads from the same samples were mapped onto the reference genome sequence using the BWA software (Li and Durbin 2010). All SLAF pair-end reads with clear index information were clustered together, based on sequence similarity which was detected using one-to-one alignment by BLAT (-tileSize = 10 -stepSize = 5). Sequences located at the same position with over 95% identity were grouped into one SLAF locus. Alleles between the parents were defined in each SLAF by the minor allele frequency (MAF) evaluation. True genotypes had markedly higher MAF values than genotypes containing sequence errors.

SLAFs filtration and genotype definition were performed

according to the method described by Sun et al. (2013), and all SLAFs had been filtered and quality assessed many times. SLAFs containing more than four tags were filtered out as repetitive SLAFs. Because pepper is diploid species, one locus can only contain at most four SLAF tags. Only SLAFs with two to four alleles were identified as polymorphic and considered potential markers. All polymorphism SLAFs loci were genotyped with consistency in the parental and offspring SNP loci. The SLAFs with >3 SNPs were filtered out. It is considered to be a high frequency variation region of sequencing, if SLAFs have more than 3 SNPs. SLAF markers with average sequence depths of less than 10-fold in parents were discarded. The marker code of the polymorphic SLAFs was analyzed according to the population type CP (cross pollinators), which consist of eight segregation types (ab \times cd, ef \times eg, hk \times hk, lm \times ll, nn \times np, $aa \times bb$, $ab \times cc$, and $cc \times ab$), as previously described by Zhang et al. (2013). Since the F_2 mapping population used here was derived from two homozygous lines, only the SLAF markers showing aa × bb segregation pattern were used for map construction.

Linkage map construction

A chi square test was used to calculate the segregation ratios of markers. Markers showing significant (P < 0.05) segregation distortion were initially excluded from the map construction. A region on the map with more than three adjacent loci that showed significant (P < 0.05) segregation distortion was defined as a segregation distortion region. SLAFs markers were allocated into 12 linkage groups (LGs) based on their locations on the reference genome. The linkage grouping uses the single-linkage clustering algorithm to cluster the markers into linkage groups, using a pair-wise modified independence LOD (MLOD) score as distance metric (Liu et al. 2014). Markers with the MLOD score < 5 were filtered to further confirm marker robustness. HighMap was used to construct and correct genetic map for each linkage (Liu et al. 2014). Briefly, recombination frequencies and LOD scores were calculated by two-point analysis. Then, a combination of enhanced Gibbs sampling, spatial sampling and simulated annealing algorithms was used to perform an iterative process of marker ordering. The error correction strategy of SMOOTH was conducted according to parental contribution of genotypes, and the k-nearest neighbor algorithm was applied to impute missing genotypes (Liu et al. 2014). Map distances were estimated using the Kosambi mapping function (Kosambi 1943). The genetic map was evaluated according to the haplotype maps, percentage of missing SLAFs, and heat maps of each linkage group.

QTL analysis

QTL analysis and mapping were initially carried out by interval mapping (IM) to identify genomic regions responsible for resistance to CMV. Subsequently, multiple QTL mapping (MQM) was conducted using the MapQTL software version 6.0 (Ooijen 2004). The genome-wide LOD threshold at the 5% significance level was determined by 1000 permutation tests for QTL significance associated with resistance to CMV. The proportion of phenotypic variation explained by each QTL was estimated using R^2 (%) value.

Results

Analysis of SLAF-seq data and SLAF markers

A total of 163 Gb of raw data was generated from SLAF library construction and high-throughput sequencing, including 1,596,590,065 pair-end reads that were 200 bp. The GC content was 39.13%, and Q30 ratio was 93.75%. In the paternal inbred line (BJ0747), the number of reads and SLAFs were 32,731,310 and 680,165 respectively, and the average coverage for each SLAF was 30.55-fold. Similarly, 29,213,950 reads were generated for 691,089 SLAFs from the maternal line (XJ0630), with an average coverage of 32.47 for each SLAF (Table 1). For the F_2 population, 400,013 to 630,875 SLAFs were produced from 5,174,133 to 12,857,051 reads, and the coverage averaged from 6.18 to 24.39 (Fig. 1). On average, 7,869,973 reads and 483,735 SLAFs with an average coverage of 11.98-fold were obtained for each progeny (Table 1). After filtering out low-quality reads and low-depth SLAFs, a total of 885,499 high-quality SLAFs were obtained. Of the SLAFs, 210,077 were polymorphic, and the polymorphism rate of the SLAFs was 23.84% (Table 2, Fig. 2). SLAFs with polymorphisms were genotyped separately for parents and population individuals, and different alphabet letters were assigned to determine segregation patterns. A total of 143,872 polymorphic SLAFs were classified into eight segregation pattern $(ab \times cd, ef \times eg, hk \times hk, lm \times ll, nn \times np, aa \times bb, ab \times cc,$ and $cc \times ab$) following the genotype-encoding rule (**Fig. 3**). Since the two parents (BJ0747 and XJ0630) were homozygous, they were assigned the genotypes aa and bb, and the 134,229 SLAFs with aa \times bb segregation patterns were selected for constructing the linkage map (Fig. 3). SLAFs were filtered to remove parental sequence depth less than 10-fold, completeness less than 99%, and significant segregation distortion (P < 0.05), in the end 14,601 SLAF markers were selected to construct a linkage map for the F2 population.

The basic characteristics of the genetic map

The 14,601 SLAF markers for the linkage map were mapped onto the pepper reference genome and using MLOD scores compared to other markers (score > 5), which showed

Table 1. Summary of SLAF depths

Sample	Total reads	SLAF numbers	Total depth	Average depth
BJ0747	32,731,310	680,165	20,778,972	30.55
XJ0630	29,213,950	691,089	22,437,765	32.47
Offspring	7,869,973	483,735	5,797,198	11.98



Fig. 1. Number of markers and average sequencing depths for F_2 individuals. (A) F_2 individuals (x-axis) and number of markers for each F_2 plant (y-axis); (B) F_2 individuals (x-axis) and the average sequencing depth (y-axis).

Table 2. Disce	Wery of SLAF mar	KC15	
Туре	Polymorphic SLAF	Non-polymorphic SLAF	Total SLAF
Number Percentage (%)	210,077 23.84	674,422 76.16	885,499 100

Table 2. Discovery of SLAF markers

that markers were distributed across 12 chromosomes. We obtained a total of 12,727 markers (**Supplemental Table 1**) were used to construct the genetic linkage maps based on the MLOD method. The average integrity of the mapping markers was 99.91%, representing a high map quality. Following the linkage analysis, the average depth of the markers was 99.38-fold in the female parent, 108.71-fold in the male parent, and 28.95-fold in the offspring. A total of 19,343 SNP loci were detected among 12,727 SLAF markers. Most of the SNPs were transition-type SNPs (67.48% of the total SNPs), the other SNPs were transversion-type SNPs (**Fig. 4**). The number of SNPs in different linkage groups ranged from 574 to 1,947 on the map.

We obtained a genetic map that totaled to 1,785.46 cM in 12 linkage groups with a mean marker distance of 0.16 cM between adjacent markers. The linkage groups were numbered according to the chromosome numbers. The genetic distance of the 12 chromosomes ranged from 119.78 cM (Chr08) to 186.90 cM (Chr03), with mean marker intervals between 0.10 cM and 0.23 cM. Overall, Chr11 was the most saturated, containing 1,627 markers and covering a length of 156.91 cM with only 0.1 cM average inter-marker distance. In contrast, Chr02 contained the largest average intervals, where distances between adjacent markers were 0.23 cM. The maximum gap was 6.29 cM on Chr02, between Marker4327730 and Marker3962343. Detailed information of the genetic map is presented in **Table 3** and **Fig. 5**.

Visualization and evaluation of the genetic map

First, a haplotype map of the 12,727 markers was generated to detect population of double exchange and the genotyping errors, as well as displaying recombination events using results from the 195 offspring and parental lines (**Supplemental Fig. 1**). Most of the recombination blocks were clearly defined, and we did not detect instances of double recombination or deletions in any linkage group.

We next used a heat map analysis to evaluate frequency of recombination between markers from each linkage group (**Supplemental Fig. 2**). The analysis suggested that most linkage groups did not experience frequent recombination.

Pepper SLAF-map and QTLs resistant to CMV



Fig. 2. The SLAFs distribution on genome of pepper. The x-axis represents chromosome length and the y-axis indicates chromosome code. The yellow bars represent chromosomes, and deeper color from yellow to black represents higher SLAFs at the corresponding location. (A) The distribution of all 885,499 of high quality SLAFs (ALL_SLAF) on genome of pepper. (B) The distribution of 210,077 of polymorphic SLAFs (POLY_SLAF) on genome of pepper.

All the mapped SLAF markers were anchored to the pepper reference genome (CM 334, Annuum v1.55) to evaluate the collinearity between the genetic map and reference genome. We observed high collinearity between the markers and corresponding chromosomes, and the genetic and physical positions followed an identical order (**Fig. 6**). The map showed coefficients of colinearity ranging between 0.82– 0.99 (P < 0.05) for the pepper reference genome comparison. Most parts of these curves represent a falling trend, suggesting that their genetic and physical positions follow an identical order. The consecutive curves generated from the 12 linkage groups indicate two facts: the genome was sufficiently covered with SLAF markers, and SLAF markers were placed accurately within each linkage group.



Genotype Distribution of SLAF Markers



Fig. 3. Number of markers in each of the eight segregation patterns.



Fig. 4. The number of SNP markers on the linkage groups.

Fable 3.	Characteristics	descriptions	of constructed	genetic mar

Chr. ID	Total marker	Total distance (cM)	Average distance (cM)	Gap < 5 cM	Max gap (cM)
Chr01	1,136	182.60	0.16	99.82%	8.45
Chr02	547	123.78	0.23	99.82%	6.29
Chr03	1,665	186.90	0.11	99.70%	14.06
Chr04	1,287	137.06	0.11	99.92%	8.97
Chr05	1,455	155.18	0.11	99.93%	7.23
Chr06	924	149.57	0.16	99.46%	9.80
Chr07	1,063	141.52	0.13	99.91%	5.41
Chr08	581	119.78	0.21	99.66%	12.85
Chr09	636	138.50	0.22	99.21%	7.65
Chr10	1,081	151.04	0.14	99.63%	9.50
Chr11	1,627	156.91	0.10	99.57%	9.85
Chr12	725	142.62	0.20	100.00%	4.58
Total	122,727	1,785.46	0.16	99.72%	8.72

Genetic Map



Fig. 5. Distribution of SLAF markers on 12 linkage groups in pepper. Black bars indicate SLAF markers. The x-axis indicates the linkage group number and the y-axis represents the map distance (cM).



Fig. 6. The collinearity of 12 chromosomes with the pepper reference genome.

QTL mapping of pepper CMV resistance

We next detected the genomic regions responsible for CMV resistance using interval mapping (IM), and confirmed QTL by multiple QTL mapping (MQM) procedure. Totally three QTLs underlying CMV resistance were found. The largest effect was displayed by *qcmv11.2* on chromosome 11, and this QTL explained 19.2% of the observed phenotypic variance (**Table 4**). *qcmv11.2* spanned an interval between 114.258 cM and 117.236 cM, where seven SLAF markers were identified. The closest marker linked with qcmv11.2 was Marker5409028. The second QTL was referred to as qcmv11.1, which was also located on chromosome 11, and accounted for 10.2% of the trait variation. QTL qcmv11.1 was flanked by Marker5510971 and Marker5227451, and fourteen SLAF markers covered this region. The third QTL was named qcmv12.1, and it had a comparatively smaller observed phenotypic variance of 7.3% (Table 4).

Discussion

High-density genetic linkage maps are critical for identifying QTLs that can be used for further map-based gene cloning. Prince *et al.* (1993) first constructed a linkage map of pepper using 192 markers covering 720.3 cM in 19 linkage groups. Subsequently, numbers of *Capsicum* genetic maps have been constructed for interspecific or intraspecific populations, and genotyped with various traditional gel-based marker systems (Barchi *et al.* 2007, Lee *et al.* 2009, Lefebvre *et al.* 1995, Mimura *et al.* 2012, Prince *et al.* 1993, Wu *et al.* 2009, Yi *et al.* 2006). However, the markers are always inefficient, expensive, and time-consuming for high-density linkage maps, which need thousands of markers (Cai *et al.* 2015, Kakioka *et al.* 2013). Application of recently developed NGS-based technologies can be used to efficiently develop high-density markers to construct genetic maps. Qin

Table 4. Genetic mapping and QTL analysis of CMV resistance trait in $F_{2:3}$ families

QTL	Chr.	Marker interval	Closest marker	Position	LOD	Additive effect	R^2
qcmv11.1	11	Marker5510971-Marker5227451	Marker6201026	58.477-60.528	3.42	0.47	10.2
qcmv11.2	11	Marker6262083-Marker5712016	Marker5409028	114.258-117.236	4.30	0.19	19.2
qcmv12.1	12	Marker17546312- Marker17412818	Marker17652010	21.442-22.468	3.58	0.23	7.3

et al. (2014) first published a high-density genetic map in an F₂ population (Bei A3×B702), containing 7,657 SNPs markers, as the scaffold of 'Zunla-1' draft genome using the Illumina's Infinium SNP-Assay. Furthermore, several high dense genetic maps for Capsicum were produced using re-sequencing or GeneChip technologies (Han et al. 2016, Hill et al. 2015, Hulse-Kemp et al. 2016, Li et al. 2015). Here, we used the SLAF-seq approach to identify a set of SLAF markers in pepper. We constructed a SLAF library of pepper and generated 163 Gb of raw data, containing 1,596,590,065 pair-end reads. Subsequently, 885,499 SLAFs were developed through high-throughput sequencing, and 14,601 polymorphic SLAF markers were identified to qualify for genetic linkage map construction. SLAF-seq is an efficient method of large-scale molecular markers discovery and genotyping. However, due to some unavoidable erroneous and missing values were contained in SLAF sequencing data, molecular markers developed in this approach must be stringently filtered to avoid false positive markers (Sun et al. 2013). In the present study, the quality score were firstly used to exclude suspicious genotyping results. In addition, reference genome mapping was used to prevent false positive results and to exclude the sequence error rate. Moreover, genotype analysis was preformed to filter out missing genotypes and Mendelian errors results. Only the segregation type $aa \times bb$ represented that the two alleles of one marker are different in both parents. The stringent filtration improved the accuracy of following association studies. Therefore, 201,077 polymorphic SLAFs were discovered initially in the sequence dataset, but only 14,601 SLAFs considered as effective markers.

Here, we obtained a linkage map, spanning 1,785.46 cM, containing 12,727 SLAF markers, where the average genetic distance between adjacent markers was only 0.16 cM. The resolution of the genetic map was improved obviously, contrasting with the previous study (Yao et al. 2013). Similar to these recent published maps (Han et al. 2016, Hill et al. 2015, Hulse-Kemp et al. 2016, Li et al. 2015, Qin et al. 2014, Zhang et al. 2016b), the short intervals between markers in the map were helpful for QTLs detection and fine-mapping. Furthermore, our map could be used to improve the quality of reference genomes by elucidating the genetic order of unordered regions and anchoring unassigned scaffolds to linkage groups. It was very important to evaluate the quality of the genetic map, and we validated the correlation of the genetic and physical positions, which suggested that the quality of the genetic map in this study is high. Despite high correlation was observed, there were still no collinearity in some narrow regions of which were located in Chr08 and Chr11. These no collinearity may be due to the lack of marker polymorphism and a shortage of markers detection in some chromosomal regions in the parental lines. Therefore, our genetic map can serve as the basis for subsequent QTL mapping of CMV-resistance traits.

CMV causes severe systemic mosaic symptoms and drastic reduction in marketable yield of pepper (Chaim *et al.*

2001, Palukaitis et al. 1992, Yao et al. 2013). In this study, we used an F₂ population derived from a cross between BJ0747 and XJ0630, in order to construct a high-density genetic map and conduct QTL mapping of CMV-resistance. The same population was used to identify QTLs for CMV resistance previously (Yao *et al.* 2013), where a genetic map of 1438.5 cM containing 137 markers onto 17 LGs was constructed. In that previous study, six QTLs for CMVresistance were identified on 4 LGs (LG4, LG7, LG8 and LG16). However, the distance between the markers was too large to accurately detect chromosomal regions causing CMV resistance. Using our improved genetic map, we refined the QTLs and detected three QTLs related to CMV resistance. Moreover, all the QTLs were mapped to intervals between 2.98 cM and 1.03 cM, which provided the possibility to predict the candidate genes.

The genetic control of resistance to CMV on pepper is complex, and most studies have found partial resistance mediated by multiple loci located on different chromosomes (Grube et al. 2000, Suzuki et al. 2003, Yao et al. 2013). Given that our major effects QTLs were located on chromosome 11, we sought to compare QTLs on chromosome 11 from previous studies investigating CMV-resistance in Capsicum sp (Caranta et al. 2002, Chaim et al. 2001, Guo et al. 2016, Palukaitis et al. 1992, Yao et al. 2013). We found two QTLs, qcmv11.1 and qcmv11.2, which explained 10.2% and 19.2% of the observed phenotypic variations respectively. These two QTLs on chromosome 11 were compared to the *qcmv.hb-8.2* locus previously identified using markers integration (Yao et al. 2013), and the result suggest that qcmv11.1 is located in the sub-region of *qcmv.hb-8.2*, while *qcmv11.2* is a new QTL conferring resistance to CMV. Therefore, *qcmv11.1* might be a stable QTL that plays a role in CMV resistance in C. annuum line 'BJ0747'. gcmv11.1 and qcmv11.2 span about 2.05 cM and 2.98 cM, with the physical positions 19.403–24.467 Mb and 255.854-256.408 Mb on chromosome 11, respectively. Our study refined the results of crossing 'BJ0747' × 'XJ0630', a population previously used by Yao et al. (2013). Previous QTLs studies of CMV resistance identified the QTL cmv11.1, which was linked to the L locus for resistance to tobacco mosaic virus in 'Perennial' and 'Vania' (Caranta et al. 2002, Chaim et al. 2001). However, cmv11.1 is located on a different chromosomal region from qcmv11.1 and qcmv11.2 in 'BJ0747'. In the pepper cultivar 'Vania', another minor-effect QTL cmv11.2 was identified, but the physical position could not be determined. We could not confirm whether the newly detected QTL *qcmv11.2* may be the same QTL as these previous studies. The most recently reported minor-effect QTL qCmr11.1 from C. frutescens cv. 'PBC688' was located on 20,999,184 bp to 24,898,720 bp on chromosome 11. The physical position of *qcmv11.1* in 'BJ0747' partly overlapped with *qCmr11.1* from 'PBC688' (Fig. 7), and we are currently investigating this overlap in QTLs. In the previous study, *qCmr11.1* was identified for containing four indel markers, flanking Indel-11-31 and Indel-11-73 (Guo et al. 2016). In



Fig. 7. The comparison of physical position between *qcmv11.1* and *qCmr11.1*. (A) Markers interval and position of *qcmv11.1*; (B) Markers interval and position of *qCmr11.1*.

our study, *qcmv11.1* was located between Marker5510971 and Marker5227451, containing 14 SLAF markers. For further mapping of *qcmv11.1*, we will develop SNPs or InDel markers based on these SLAF markers in the candidate regions. In addition, a secondary population of carrying the *qcmv11.1* fragment will be developed for improved mapping of the genes that regulate CMV resistance in 'BJ0747'. We also identified a novel minor locus *qcmv12.1* in BJ0747, which influenced 7.3% of the phenotypic variance. A major-effect QTL named *cmv 12.1* was previously identified using AFLP markers E33/M48–132 and E40/M47–262 from the pepper cultivar 'Vania' (Caranta *et al.* 2002), and we will screen our offspring population using the E33/M48 and E40/M47 markers to test whether *qcmv12.1* and *cmv 12.1* may be the same chromosomal region.

In summary, we generated a high-density genetic map in pepper using SLAF-seq, demonstrating that SLAF-seq is an efficient method for marker discovery and high-density linkage map construction. Using this high-density genetic map, we identified three QTLs linked to CMV-resistance. qcmv11.1 appeared to be a stable QTL associated with CMV-resistant across different experiments in the same population. In addition, our analysis considerably narrowed the QTL intervals of *qcmv11.1*, which increases the possibility of predicting CMV-resistant candidate genes for further research. Moreover, the markers closely linked to CMV-resistant can be used for MAS in pepper breeding to facilitate the identification of genes underlying CMVresistance. This study also illustrates the advantages of high-density genetic mapping analysis for improving better quality QTLs underlying complex traits.

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