ORIGINAL ARTICLE

Fine-mapping and candidate gene analysis of the *Brassica juncea* **white-flowered mutant** *Bjpc2* **using the whole-genome resequencing**

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Abstract Flower color in *Brassica* spp. is an important trait and considered a major visual signal for insect-pollinated plants. In previous study, we isolated and identified two genes (*BjPC1* and *BjPC2*) that control the flower color in *B. juncea*, and mapped *BjPC1* to a 0.13-cM region. In this study, we report the fine-mapping and candidate analysis of *BjPC2*. We conducted whole-genome resequencing, using bulked segregant analysis (BSA) to determine the *BjPC2* candidate intervals. Crossing, allelism testing, and repeated full-sib mating were used to generate XG3, a near isogenic line (NIL) population that segregated on the *BjPC2* locus. Through a genome-wide comparison of single nucleotide polymorphism (SNP) profiles between the yellow- and white-flowered bulks, a candidate interval for *BjPC2* was identified on chromosome B04 (2.45 Mb). The *BjPC2* linkage map was constructed with the newly developed simple sequence repeat (SSR) markers in the candidate interval to narrow the candidate *BjPC2* region to 31-kb. Expression profiling and RNA-seq analysis partially confirmed that the *AtPES2* homolog, *BjuB027334* is the most promising candidate gene for *BjPC2*. Furthermore, analyses with high pressure liquid chromatography and transmission electron microscopy demonstrated that *BjPC2* might be important

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 \boxtimes Jinxiong Shen jxshen@mail.hzau.edu.cn in xanthophyll esterification, a process that limits xanthophyll degradation and increases sequestration. Overall, we mapped the *BjPC2* to a 31-kb region on the B04 in *B. juncea* and identified *BjuB027334* as a valuable candidate gene. Our results provide a basis for understanding the molecular mechanisms underlying the white-flowered trait and for molecular marker-assisted selection of flower color in *B. juncea* breeding.

Keywords *Brassica juncea* · White flower · Wholegenome resequencing · Fine-mapping · Candidate genes · Xanthophyll esterification

Introduction

Brassica juncea (AABB, 2*n*=36) is an allopolyploid species that originated by the hybridization of *B. rapa* (AA, $2n=20$) and *B. nigra* (BB, $2n=16$). As one of the major oilseed crops in *Brassica, Brassica juncea* has several valuable agronomic characteristics, including early maturity, drought tolerance, disease resistance, tolerance to poor soil, shattering resistance, and yellow seeds (Downey [1990](#page-10-0); Woods et al. [1991\)](#page-11-0), making it highly suitable for planting in droughtprone regions. Recently, *B. juncea* has begun to gain importance as an alternative to *B. napus* in Canada and the USA (Negi et al. [2000\)](#page-10-1). However, despite its broad distribution in western plateau region of China and the abundance of its genetic resources (Xiao et al. [2013\)](#page-11-1), *B. juncea* research is still in its early stages. Therefore, investigation of genetic patterns and development of molecular markers and identification of candidate genes provide a basis for using the genetic resources and molecular marker-assisted selection (MAS) for valuable agronomic characteristics in *B. juncea*.

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In this study, we aimed to identify a candidate gene for the flower color trait in *B. juncea*.

The flower color is among the traits of greatest interest in *Brassica* spp. (Pearson [1929](#page-11-2)); it is an environmentally independent character that is particularly useful for ornamental and landscaping purposes. The phenotype is either yellow or white, with the clearly visible white coloration being valuable for identifying the true/false hybrids or for evaluating the seed purity in hybrid production. The inheritance mechanism of *Brassica* flower color varies across species. In *B. rapa*, a single, fully dominant gene controls the white flower coloration and no cytoplasmic effects are apparent (Lee et al. [2014;](#page-10-2) Rahman [2001](#page-11-3)), whereas in *B. carinata*, the single gene has incomplete dominance over the yellow flower trait (Jambhulkar and Raut [1995\)](#page-10-3). Although also controlled by a single nuclear gene (carotenoid cleavage dioxygenase 4, *BnaC3.CCD*), the white coloration is dominant over yellow in *B. napus* (Huang et al. [2014](#page-10-4); Liu et al. [2004;](#page-10-5) Zhang et al. [2015\)](#page-11-4). Currently, we know that white flower pigmentation in *B. juncea* is influenced by the interaction of two gene pairs (Alam and Aziz [1954;](#page-10-6) Bhuiyan [1986](#page-10-7); Rawat and Anand [1986](#page-11-5); Singh et al. [1964](#page-11-6); Singh and Chauhan [2011\)](#page-11-7), but the exact molecular basis remains poorly understood.

In nature, carotenoids, flavonoids, and betalains are the three pigments responsible for flower color, with the former generating yellows, oranges, and reds (Grotewold [2006](#page-10-8)). The most common carotenoids in the yellow flower organs are the xanthophylls. Carotenoids are present in both chloroplasts and chromoplasts. In the former, carotenoids are essential to the antenna complex of photosynthesis and to photoprotective mechanisms in plant cells (Grotewold [2006](#page-10-8); Walter and Strack [2011](#page-11-8)). In the latter, carotenoids are the primary pigments (Bramley [2002;](#page-10-9) Camara et al. [1995\)](#page-10-10) and the source of distinct pigmentation that attracts pollinators or seed dispersers (And and Baker [1983\)](#page-10-11). Carotenoid levels are modulated by sequestration within specific lipoproteins or plastoglobuli of chromoplasts (Ariizumi et al. [2014;](#page-10-12) Deruère et al. [1994\)](#page-10-13), as well as enzymatic degradation (Auldridge et al. [2006;](#page-10-14) Zhang et al. [2015\)](#page-11-4). Two groups of carotenoid oxygenases have been identified to work in different plant processes: carotenoid cleavage dioxygenases (CCDs) and the cis 9-carotenoid cleavage dioxygenases (NCEDs). The latter are involved in the synthesis of major plant apocarotenoids, including phytohormones strigolactone and abscisic acid (ABA) (Walter and Strack [2011](#page-11-8)). Specifically, the cleavage reaction of 9-*cis*-violaxanthin and 9-*cis*-neoxanthin is the rate-limiting step in ABA biosynthesis (Cutler and Krochko [1999](#page-10-15)).

Bulked segregant analysis (BSA) is a simple and effective technique used to identify molecular markers linked to target genes. The method genotypes bulked DNA samples from two groups of individuals with extremely different phenotypes in a given trait of interest (Michelmore et al. [1991\)](#page-10-16). Newly available next-generation sequencing (NGS) techniques, including whole-genome resequencing, can make use full of BSA and high-throughput genotyping to clarify genetic architecture, identifying quantitative trait loci (QTLs) and candidate genes. For example, BSA and whole-genome resequencing have successfully identified the candidate gene, *BrTT1*, for the seed coat color trait in *B. rapa* (Wang et al. [2016\)](#page-11-9), while genome resequencing found candidate genes for an early-maturing soybean mutant (Lee et al. [2016](#page-10-17)). Detailed genomic studies on nonmodel organisms are even possible now, thanks to the NGS technique of transcriptome analysis (RNA-seq), a rapid and cost-effective approach for obtaining a massive database of expressed genes without requiring a full sequenced genome. The resultant information is strongly applicable for research in ecological, comparative, structural, regulatory, and evolutionary genomics (Khan et al. [2017;](#page-10-18) Li et al. [2017](#page-10-19); Shi et al. [2015](#page-11-10); Xiong et al. [2017](#page-11-11); Zhang et al. [2017](#page-11-12)).

Previously, we reported a white-flowered trait in *B. juncea* that exhibited reduced yellow flower pigmentation. In this study, we aimed to identify a single-gene locus for this trait, performing whole-genome resequencing on the parents and on two bulked samples of yellow-flowered and white-flowered offspring. Expression profiling and RNA-seq results were then confirmed using a combination of finemapping and whole-genome resequencing. Finally, highperformance liquid chromatography (HPLC) and transcription electron microscopy (TEM) demonstrated that *BjPC2* might be important in xanthophyll esterification, a process that limits degradation and increases sequestration of this major carotenoid group. Our results provide insight into the genetic mechanisms of flower color in *B. juncea* and act as a solid foundation for further functional validation of candidate genes and marker-based breeding of *B. juncea* varieties.

Materials and methods

Plant materials and population construction

The white-flowered JG800-1(genotype: *Bjpc1Bjpc1Bjpc2Bjpc2*) and yellow-flowered L12-5 (genotype: *BjPC1BjPC1BjPC2BjPC2*) lines of *B. juncea* were self-pollinated for over five generations to yield stable petal coloration. In our previous study, we successfully generated nine $BC₃$ lines (designated XG1-9) with 1:1 segregation at the white locus. Line XG1 was selected for mapping *BjPC1*. After applying the developed *BjPC1* linkage markers to identify the remaining eight lines (XG2–9), we confirmed that XG2, XG7, XG8 and XG9 had the same genotype as XG1. However XG3, XG4, XG5 and XG6 segregated in the *BjPC2*/*Bjpc2* locus. Therefore, line XG3 was used to map *BjPC2*. A BC₄ population (donor parent: L12-5; recurrent parent: JG800-1)

comprising 2,016 individuals was used for the molecular mapping of *BjPC2* (for pedigree and genesis, see supplementary Fig. S1). All the materials were provided by the Department of Rapeseed Research at Huazhong Agricultural University.

Allelism analysis

To determine allelism between XG3 and XG1, the yellowflowered XG1 (expected genotype: *BjPC1Bjpc1Bjpc2Bjpc2*) and XG3 (expected genotype: *Bjpc1Bjpc1BjPC2Bjpc2*) were self-fertilized and the crossed. All resultant progeny (15 individuals; expected phenotype: yellow flowers; expected genotypes: *BjPC1Bjpc1BjPC2Bjpc2, BjPC1Bjpc1Bjpc2Bjpc2* or *Bjpc1Bjpc1BjPC2Bjpc2*) were self-fertilized and simultaneously test-crossed with JG800-1 (genotype: *Bjpc1Bjpc1Bjpc2Bjpc2*) to yield 19 populations. The allelic relationship between XG3 and XG1 was then identified through an assay of flower-color segregation ratio. If XG3 was not allelic to XG1, selfed populations would have a segregation ratio of 15:1 or 3:1 (yellow: white); ratios for test-crossed populations would be 3:1 or 1:1 (Supplementary Fig. S2a). However, if XG3 was allelic to XG1, the two genotypes would be identical and selfing would result in two segregating populations: one with a 3:1ratio and the other comprised entirely of yellow-flowered plants. Test-crossed populations would exhibit all yellow flowers and 1:1 segregating populations (Supplementary Fig. S2b).

DNA library construction and whole-genome resequencing

Using CTAB, total genomic DNA was isolated from young leaves of parents and BC_4 plants (Doyle [1990\)](#page-10-20). The DNA was quantified using the NanoDrop 2000 spectrophotometer (Thermo Scientific, USA). To generate the bulked samples, 30 yellow-flowered and 30 white-flowered plants were chosen from the BC_4 population; an equal amount of DNA from each plant per group was mixed to form the yellowflowered (Y-pool) and white-flowered (W-pool) set at a final concentration of 40 ng/μL. Isolated DNA was used to generate sequencing libraries. DNA samples were sonicated to produce 350-bp fragments. Sheared DNA was end-repaired, a single nucleotide (A) overhang was added subsequently, and then sequencing adapters were ligated using T4 DNA ligase. Polymerase chain reaction was performed and the products were then purified and sequenced on an Illumina HiSeq system using the standard protocol. The two parental lines had a sequencing depth of \sim 20 \times ; each bulk, \sim 30 \times . The low-quality reads (quality score<20e) were filtered out, and raw reads were sorted to each progeny based on barcode sequences. After barcodes were trimmed, clean, high-quality reads from the same sample were mapped onto the *B. juncea*

genome sequence (955.08 Mb; Yang et al. [2016](#page-11-13)) in Burrows-Wheeler Aligner (Li et al. [2009](#page-10-21)). Duplicates were marked in Samtools (Li and Durbin [2009](#page-10-22)), while local realignment and base recalibration were performed in GATK (Mckenna et al. [2010](#page-10-23)). Both programs were combined for a SNP-calling analysis using default parameters, generating a SNP set. All identified SNPs shared across the bulk were considered polymorphic in association studies. Next, Δ (SNP-index) was calculated; this is an association analysis method that finds significant differences in genotype frequency between two pools (Abe et al. [2012](#page-10-24)). The upper limit of Δ (SNPindex) is expected to be 0.5 for a BC_4 population. To determine and obtain the association threshold, we performed loess regression fitting (Abe et al. [2012](#page-10-24)). Candidate *BjPC2* regions over the threshold (99.7th -percrntile) were extracted from Linkage group by BMK (Beijing, China).

Fine mapping of the white-flowered gene *Bjpc2*

The BC_4 population (1:1 yellow: white ratio) was used to fine-map *Bjpc2*. Equivalent amounts of DNA from 12 yellow-flowered BC_4 plants were randomly selected to construct two yellow-flowered gene pools. Two white-flowered gene pools were built in the same way, and all four were used to screen molecular markers. New simple-sequence repeat (SSR) markers were developed in candidate intervals according to the *B. junce*a reference genome sequences. The SSR primers were developed using WebSat ([http://wsmart](http://wsmartins.net/websat/)[ins.net/websat/](http://wsmartins.net/websat/)) (see Supplementary Table S1 for full list). Recombinant individuals in BC_4 were screened using markers with tight linkage to *BjPC2*, and their genetic distances were calculated using the Kosambi function (Kowalski et al. [1994](#page-10-25)). Synteny analysis was performed between the linked markers and the *B. juncea* genome, and then a physical map of the region encompassing the *BjPC2* was constructed. To further fine map the *BjPC2* and to identify the candidate gene, total RNA was extracted from the blooming petals of three yellow and white flowers in individuals from the BC_4 population and was separately pooled to create two independent samples that were used to identify the differentially expressed genes (DEGs) between the yellow- and whiteflowered *B. juncea* plants. For DEG screening, we used a *P* value < 0.005 and $log2$ (fold change) ≥ 1 as the threshold for determining the significance of differences in the gene expression. FC is the ratio of FPKM (fragments per kilobase per million) between yellow (Y) and white (W) petals.

Carotenoid analysis

Fresh petals were used for HPLC analysis coupled with photo-diode array detection analysis, following previously published methods (Cao et al. [2012\)](#page-10-26). Non-esterified carotenoids were identified and quantified using HPLC with saponification, while esterified carotenoids were subjected to HPLC without saponification (Yamamizo et al. [2010](#page-11-14)). Carotenoid compounds were identified based on characteristic absorption spectra and typical retention time, taken from existing literature and standards of CaroNature Co. (Bern, Switzerland). Individual carotenoid content was calculated following previous methods (Morris et al. [2004\)](#page-10-27). All analyses were conducted using at least three biological replicates. Means and standard errors were also calculated.

Transmission electron microscopy analysis

Yellow and white flower petals from three developmental stages (Fig. [1\)](#page-3-0) were cut into 1×1 cm sections, fixed in a 2.5% (w/v) glutaraldehyde with 0.1 M phosphate buffer (pH 7.4), then fixed again in 1% OsO₄ made using the same buffer (Zhu et al. [2014\)](#page-11-15). Transmission electron microscopy of the petal samples was performed as previously described (Yi et al. [2010\)](#page-11-16).

Real-time quantitative PCR (qRT-PCR) analysis

Total RNA was isolated using Trizol (Invitrogen). One microgram of total RNA from stems, leaves, sepals, stamens, pistils, and petals of yellow- and white-flowered plants were processed by RNase-free DNaseI to remove contamination. Samples were then reverse-tran-scribed into first-strand cDNA using the RevertAid First Strand cDNA Synthesis Kit (Thermo Scientific, USA). Gene-specific primers were used in reactions performed with the SYBR Green Real-time PCR Master Mix (TOYOBO, Japan) in a Bio-Rad CFX96 in strument. Each qRT-PCR experiment was repeated three times. Relative expression levels were calculated using the 2-ΔΔCt method with *Actin* as an internal control.

Results

Allelism analysis between XG3 and XG1

The flower-color segregation ratios of 13 self-fertilized populations (F1 progeny of $XG1 \times XG3$) were 15:1 (yellow:white) or 3:1 ($X_2^{0.05} = 3.84$; $P > 0.05$). We did not observe populations with only yellow flowers. Furthermore, six corresponding test-crossed populations (F1 crossed with JG800-1) showed a flower color ratio of 3:1 or 1:1 ($X_2^{0.05}$ = 3.84; *P* > 0.05), with no population consisting entirely of yellow-flowered plants (Supplementary Tables S2, S3). These data clearly indicate that the segregating loci of XG3 and XG1 were not allelic. Thus, the genotypes of yellow-flowered plants in XG3 and XG1 were *Bjpc1Bjpc1BjPC2Bjpc2* and *BjPC1Bjpc1Bjpc2Bjpc2*, respectively.

Whole-genome resequencing analysis

After filtering 149.09 G of raw data, 148.53 G of clean data was obtained for further analysis. The Q30 ratio was 88.76% and the GC content was 41.67%. The genome resequencing depth was 110 for four samples with an average $>37\times$ and genome coverage > 88% (Supplementary Tables S3).

Fig. 1 Petal coloration in the yellow- and white-flowered plants from the *Brassica juncea* BC4 population. Petals in three different developmental stages are shown. Stage 1 (**a, e**) is equivalent to 5 days before

the flowering period, stage 2 (**b, f**) is 1 day before the flowering period, stage 3 (**c, g**) is the flowering period, bar 0.5 cm

Compared with the reference genome, 2,597,605 SNPs and 1,004,480 insertion–deletions (indels) were identified between the yellow- and white-flowered parents (Supplementary Tables S3). Additionally, 2,700,072 SNPs and 1,068,848 indels were found in the two BC_4 bulk segregant populations. Association analysis between the two bulks was performed on 1,193,969 SNPs and a Δ (SNP-index) was indicated by calculating SNP-index (Fig. [2\)](#page-5-0). Two candidate intervals (0.06–1.66 and 2.12–2.97 Mb) exceeded the threshold value for *BjPC2* on J16 (chromosome B04 of *B. juncea*) (Fig. [3a](#page-6-0)). Together, the candidate regions were around 2.45 Mb with approximately 371 annotated genes. We found 431 SNPs with non-synonymous coding between the parents, and 291 SNPs with non-synonymous coding across the 110 genes between the two bulks. These SNPs are likely to be directly associated with flower color. In summary, we showed that the candidate genes for flower color were all located on chromosome B04 of *B. juncea*.

Fine mapping of *BjPC2*

For whole-genome resequencing, we developed 138 SSR primer pairs based on the sequence of the 2.45 Mb candidate regions. 16 SSR primer pairs detected polymorphisms between the two flower-color bulks were used to genomic DNA markers in 96 individuals, and nine polymorphic markers were identified as being linked to *BjPC2*. Meanwhile, the *BjPC1* linkage markers were applied to screen the above 96 individuals, and the result revealed one SSR marker Z6SSR26 also linked with the *BjPC2*. To more precisely map *BjPC2*, all individuals in the BC4 population were screened by the linkage markers to evaluate their genetic distance. 81 recombinants between Z6SSR26 and, and 17 between SSR104 and *BjPC2* were identified. On the side of SSR104, one recombinant was detected between the closest marker SSR111 and *BjPC2*, while four recombinants were detected between the closest marker SSR78 on the other side and *BjPC2*. By screening, we found that SSR80 and SS110 co-segregated with *BjPC2* were no recombinant. Finally, we constructed a genetic linkage map surrounding the *BjPC2* (Fig. [3](#page-6-0)), and the *BjPC2* was located in an interval between the markers SSR78 and SSR111, corresponding to a genetic distance of 0.25-cM.

Candidate gene identification

Based on the linkage map (Fig. [3\)](#page-6-0), *BjPC2* was located on chromosome B04 of *B. juncea*. The target region for *BjPC2* was narrowed to a 31-kb interval containing six predicted genes in the *B. juncea* reference genome (Table [1\)](#page-6-1). The functional genes predicted in this region included two genes encoding phytyl ester synthase 2, one encoding an esterase/lipase/thioesterase family protein, one encoding a hydroxyproline-rich glycoprotein family protein, one encoding a DHHC-type zinc finger family protein and one encoding dsRNA-binding protein 3.

To study the differential expression of these six annotated genes and identify the candidate gene for *BjPC2*, we examined their transcripts in yellow and white petals. Five of the six genes contained non-synonymous mutations between the yellow- and white-flowered traits. Among these five genes, *BjuB027331* and *BjuB027333*had extremely low transcript levels and were barely detected in petals. *BjuB027330* and *BjuB027332* expression were also low, but the latter increased in yellow petals compared to white petals. *BjuB027334* is highly homologous to *AT3G26840* (*PES2)* in *Arabidopsis*, which encodes a protein with phytylester synthesis and diacylglycerol acyltransferase activities. *BjuB027334* expression decreased approximately sevenfold in white petals than in yellow petals (Fig. [4](#page-7-0)a).Therefore, we hypothesized that the *BjuB027334* gene was the most likely candidate gene for *BjPC2*. Subsequently, the expression analysis in different organizations from BC4 population showed that *BjuB027334* was predominantly expressed in petals (Fig. [4](#page-7-0)b). Our RNA-seq analysis identified 164 DEGs, including 50 down-regulated and 114 up-regulated DEGs in the white petals. The *BjuB027334* gene was down-regulated five-fold in the white petals than in the yellow petals. Nevertheless, there were no DEGs annotated to the carotenoid biosynthesis pathway. Together, these data further suggest that *BjuB027334* is a candidate gene for the flower-color locus in *B. juncea*.

Carotenoid analysis in yellow and white petals using HPLC

We analyzed carotenoid profiles in yellow and white petals to investigate whether low pigmentation was due to decreased carotenoid accumulation. Esterified carotenoids were abundant in yellow petals (Fig. [5](#page-7-1)). Furthermore, HPLC analysis without saponification revealed more carotenoid peaks in yellow flowers than white flowers (Fig. [5\)](#page-7-1). The peaks that appeared after 20 min were more likely to be esterified carotenoids, saponified extracts rarely exhibited later peaks (Fig. [5\)](#page-7-1). We then compared the retention times and absorbance spectra of carotenoid peaks with those of standards to identify six carotenoids: violaxanthin, 9-*cis*-violaxanthin, *cis*-neoxanthin, luteoxanthin, lutein and β-cryptoxanthin (Table [2](#page-8-0)). The six peaks exhibited some minor differences under HPLC without saponification; however, HPLC with saponification showed that violaxanthin, 9-*cis*-violaxanthin and *cis*-neoxanthin accounted for 91.6% of the total carotenoids in yellow petals, approximately eight times higher than their percentage in white petals (a significant difference; Table [2](#page-8-0)). These results indicate that white petals do not accumulate carotenoid esters, thus leading to a decrease in

Fig. 2 The layout of SNP index and Δ(SNP Index). **a** The distribution of SNP index of the white-flowered bulk from the BC_4 population. **b** The distribution of SNP index of the yellow-flowered bulk from the BC_4 population. **c** The layout of $\Delta(SNP \text{ Index})$ value. The

red dashed line represents the threshold line. The *x*-axis (J01–J18) represents chromosome number in *B. juncea* chromosome V1. (Color figure online)

Fig. 3 Fine-mapping of the *BjPC2* in *Brassica. juncea*. **a** The candidate interval for *BjPC2* on chromosome B04. **b** The genetic linkage map of the *BjPC2* and associated molecular markers in BC4 population. **c** A partial physical map of linkage markers for *BjPC2* on chromosome B04 of *B. juncea*. The black section shows the candidate region for *BjPC2*. **d** A partial physical map of *Arabidopsis thaliana* showing regions homologous to chromosome B04 of *B. juncea*

Table 1 Predicted *B. juncea* and *B. rapa* genes in the candidate region of the *BjPC2* locus and their *A. thaliana* homologs based on BLASTX searches

carotenoid accumulation. Moreover, yellow-flowered petals in *B. juncea* are the result of heavy carotenoid (particularly violaxanthin) accumulation.

Ultrastructure analysis of chromoplasts in yellow and white petals

We used TEM to determine whether changes in chromoplast morphology contributed to reduced petal pigmentation in white *B. juncea* flowers. At stage 1 in both yellow- and white-flowered plants, petal plastids exhibited a chloroplastic structure with granal stacking. In yellow flowers only, a few plastoglobules (PGs) appeared as electron-dense granules in plastids (Fig. [6a](#page-8-1), d). In stage 2, plastids of yellow petals began differentiating into chromoplasts, and PGs were less electron-dense than stage-1 PGs (Fig. [6b](#page-8-1)). However, plastids in white petals were barely visible, and only a few, electron-dense PGs were present (Fig. [6e](#page-8-1)). During stage 3, complete chromoplasts were present in yellow petals, filled with numerous, fully developed PGs (as suggested by a low

Fig. 4 Gene expression data analysis. **a** Relative expression of genes in the candidate region of $BjPC2$ from differently colored BC_4 plants at anthesis. "Yellow" and "white" represent individuals from yel-

low- and white-flowered plants, respectively. **b** Relative expression of $BjuB027334$ in different tissues of BC_4 plants. (Color figure online)

Fig. 5 Carotenoids profiles in yellow and white petals. Carotenoid extracts from mature petals were subjected to high-performance liquid chromatography without saponification (left column) or with saponification (right column). Carotenoid esters were detected in non-

saponified yellow mature petals, while no such esters were detected in the saponified yellow mature petals due to the hydrolysis of ester compounds. The *x*-axis represents retention time and the *y*-axis represents milli-absorbance units (AU). (Color figure online)

Table 2 Component of the carotenoid in the yellow- and white-flowered petals of *B. juncea*

| Compounds | Yellow $(\mu g/g)$ | White $(\mu g/g)$ |
|------------------------|--------------------|-------------------|
| Violaxanthin | 511.82 ± 28.73 | 50.36 ± 4.62 |
| 9-cis-Violaxanthin | 59.74 ± 4.21 | 38.06 ± 1.29 |
| cis-Neoxanthin | 134.58 ± 7.53 | 2.43 ± 0.06 |
| Luteoxanthin | 27.78 ± 0.64 | $0.60 + 0.11$ |
| Lutein | 33.65 ± 4.41 | 1.42 ± 0.17 |
| β -Cryptoxanthin | 1.49 ± 0.17 | 1.28 ± 0.13 |
| Unknow | 1.73 ± 0.51 | 0.51 ± 0.04 |
| Total | 770.78 ± 33.79 | $94.67 + 5.74$ |

Mean of three replicates plus SD

electron density inside and high density on the surface) (Fig. [6c](#page-8-1)). In contrast, stage-3 white petals did not exhibit further chromoplast development; the plastids appeared flattened, with only a few small PGs surrounded by an incomplete envelope membrane (Fig. [6](#page-8-1)f).

Discussion

This study characterized a *B.juncea* mutant with low petal pigmentation (Fig. [1](#page-3-0)). Using HPLC with saponification, we observed that violaxanthin and 9-*cis*-violaxanthin, which accounted for approximately 93% of the total carotenoids present and significantly greater than concentrations in white petals. Our results are consistent with previous work showing that yellow petal is due to the accumulation of these xanthophylls (Ariizumi et al. [2014](#page-10-12); Neuman et al. [2014](#page-10-28); Zhang et al. [2015](#page-11-4)). Moreover, HPLC without saponification showed that yellow-petals contained abundant carotenoid esters, mostly with backbones derived from violaxanthin, 9-*cis*-violaxanthin and *cis*-neoxanthin Thus, the three xanthophylls exist as a mixture of free (non-esterified) and esterified forms, with the latter being more prominent in yellow petals. Together, these results show that *BjPC2* plays critical role in the production of xanthophyll esters required for yellow pigmentation in *B. juncea* petals.

In this study, we successfully combined BSA with wholegenome resequencing to fine-map the target gene *BjPC2*. Aided by the newly released *B. juncea* genome assemblies (Yang et al. [2016](#page-11-13)), the rapid development of a *Brassica* genomic infrastructure (including molecular marker techniques such SNP chips), and high-throughput genotyping by sequencing (GBS) using SNPs (Geng et al. [2016;](#page-10-29) Lee et al. [2016](#page-10-17); Wang et al. [2016](#page-11-9)), we were able to detect two significant genomic regions for *BjPC2*, covering 2.45 Mb on chromosome B04. New SSR markers designed from sequences in these two regions allowed us to fine-map *BjPC2*, then localize it on to a 31-kb region on chromosome B04, where six genes were annotated. Our research clearly shows that

Fig. 6 Transmission electron microscopy was used to analyze plastid morphology of petal three developmental stages (stages 1, 2, and 3) in the yellow (**a**–**c**) and white flowers (**d**–**f**). plastoglobules (PG), granal stacks (GS), and starch grain (S). Bar 0.5 µm

combining BSA with whole genome resequencing is an effective and rapid method to locate genes for important traits in diploid plants. These two techniques can verify molecular marker-based mapping results while improving their accuracy (Wang et al. [2016\)](#page-11-9).

Our qRT-PCR analyses found that most of the six annotated genes within the 31-kb region were lowly expressed or not detected in both yellow and white petals. Only *BjuB027334* was significantly and differentially expressed, being far higher in yellow *B. juncea* petals. Additionally, whole-genome resequencing revealed that non-synonymous mutations between the yellow- and the white-flowered traits are present in *BjuB027334*. The loss of *BjuB027334* expression is likely responsible for pigment absence in white *B. juncea* petals. Further expression profiling and RNA-seq analysis have partially confirmed this hypothesis. Moreover, RNA-seq results showed that white and yellow flowers did not have significantly different carotenogenic genes, suggesting that the former plants do not influence their transcription, despite a known correlation between carotenogenic gene expression with carotenoid content(Fraser et al. [2007](#page-10-30); Ruiz-Sola and Rodríguez-Concepción [2012\)](#page-11-17). In addition, the biosynthesis of xanthophyll was likely unaffected in white flowers, as HPLC without saponification showed that white petals had nearly the same xanthophyll content as yellow petals. Degradation pathways for modulated carotenoid levels yielded the same result. Further, none of the DEGs were annotated as either CCDs or NCEDs. Taken together, these results suggest that changes in the carotenoid biosynthesis or degradation are not the cause of any carotenoid reduction in white petals. However, we found evidence that variation in carotenoid accumulation has more to do with plastid morphology. Chloroplast–chromoplast conversion and chromoplast structure differed between yellow- and white-flowered plants. In the latter, PGs failed to fully develop, with far fewer PGs in the abnormal chromoplasts. Corroborating our results, several evidences proved that carotenoid sequestration by lipoproteins (Deruère et al. [1994](#page-10-13)) is associated with the plastid morphology, such as the chromoplast size and PG (or fibril) number within the chromoplast (Deruère et al. [1994;](#page-10-13) Fraser et al. [2007;](#page-10-30) Egea et al. [2010](#page-10-31); Nogueira et al. [2013;](#page-10-32) Ariizumi et al. [2014](#page-10-12)). These findings suggest that the loss of xanthophyll esterification in white petals alters carotenoid sequestration, thereby reducing total carotenoid content and changing petal color.

Our HPLC analysis strongly suggests that *BjPC2* primarily functions accumulate xanthophylls in the chromoplast PGs of yellow flowers by esterify. However, to date, research has isolated only one enzyme known to influence xanthophyll esterification in plants: the tomato *PYP1* (*Arabidopsis PES1* homolog) (Ariizumi et al. [2014](#page-10-12)). *BjuB027334* is a down-regulated DEG annotated as *PES2* and is a member of an acyltransferase family. In *Arabidopsis, PES2* encodes a protein with phytyl ester synthesis and diacylglycerol acyltransferase activities during chlorosis, similar to *PES1* (Lippold et al. [2012](#page-10-33)), although PES2 may contribute more to phytyl-ester synthesis. Both proteins are also acyltransferase restricted to chlorophyllcontaining organisms. To date, no studies have directly reported a relationship between *PES2* and yellow-pigment accumulation. In *Arabidopsis, PES2* is also a prime candidate for wax-synthase activity involved in the production of medium-chain wax esters (Aslan et al. [2014\)](#page-10-34). However, in tomato, loss of *PYP1* function produces pale yellow petals and anthers (Ariizumi et al. [2014](#page-10-12)). We, therefore, speculate that *BjuB027334* is the candidate gene involved in xanthophyll-ester production and thus the accumulation of more yellow pigment in *B. juncea* petals. These findings are consistent with results showing that esterification prevents xanthophyll degradation and increases xanthophyll sequestration efficiency. This mechanism facilitates the yellow flower organs to accumulate more esterified xanthophylls than free-form xanthophylls (Ariizumi et al. [2014\)](#page-10-12).

In conclusion, our study demonstrates that *BjPC2* is necessary for the production of xanthophyll esters in yellow *B. juncea* flowers. This gene may encode a protein that catalyzes xanthophyll-ester formation and leads to more carotenoid accumulation in chromoplasts of yellow flowers. We identified two candidate regions (totaling 2.45 Mb) on chromosome B04 with 271 candidate genes that are tightly associated with the white-flowered trait. Subsequently, the *BjPC2* gene was fine-mapped on B04 and was physically localized to a 31-kb region. Expression profiling and RNAseq analysis then revealed that *BjuB027334*, a gene with non-synonymous mutations between white- and yellow-petal genotypes, seems to be a candidate for the flower color loci in *B. juncea*. To conclude, this study successfully combined whole-genome resequencing technology with BSA to identify candidate genes required for *B. juncea* flower pigmentation, demonstrating the utility of these techniques. Our results lay both technical and empirical groundwork for further functional studies of white flower-related genes that will ultimately decipher the mechanisms responsible for the carotenoid content in yellow flowers. Such knowledge will also be valuable for research on other polychrome horticultural crops.

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Compliance with ethical standards

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

Ethical standards The authors declare that the experiments complied with the current laws of China.

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