

Article

# Construction of an Onion (*Allium cepa* L.) Genetic Linkage Map Using Genotyping-by-Sequencing Analysis with a Reference Gene Set and Identification of QTLs Controlling Anthocyanin Synthesis and Content

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Abstract: Anthocyanins, the pigmented flavonoids responsible for red and blue colors in horticultural products, promote human health by preventing cancers and lowering the risk of cardiovascular disease. Red onions contain several cyanidin- and peonidin-based anthocyanins. In this study, we constructed a single-nucleotide polymorphism (SNP)-based genetic linkage map in an  $F_2$  segregating population derived from a cross between the inbred line 'SP3B' (yellow bulb) and the doubled haploid line 'H6' (red bulb) to identify quantitative trait loci (QTLs) for total anthocyanin content of onion bulbs using a genotyping-by-sequencing (GBS) analysis based on a reference gene set. A total of 101.9 Gbp of raw sequences were generated using an Illumina HiSeq 2500 system and a total of 1625 SNP loci were identified with the criteria of three minimum depths, lower than 30% missing rate, and more than 5% minor allele frequency. As a result, an onion genetic linkage map consisting of 319 GBS-based SNP loci and 34 high-resolution melting (HRM) markers was constructed with eight linkage groups and a total genetic distance of 881.4 cM. In addition, the linkage groups were assigned to corresponding chromosomes by comparison with the reference genetic map OH1×5225 through marker development based on common transcripts. The analysis revealed one major QTL, qAS7.1, for anthocyanin synthesis and two significant QTLs, qAC4.1 and qAC4.2, for anthocyanin content. The QTL qAS7.1, located on chromosome 7 with a phenotypic variation of 87.61%, may be a dihydroflavonol 4-reductase (DFR) gene that determines whether the bulb color is red or yellow. The QTLs qAC4.1 and qAC4.2 are separately positioned on chromosome 4 with  $R^2$  values of 19.43% and 26.28%, respectively. This map and QTL information will contribute to marker development and breeding for high anthocyanin content in bulb onion.

Keywords: anthocyanin; bulb color; GBS; HRM; QTL; transcriptome

## 1. Introduction

Bulb onion (*Allium cepa* L.; 2n = 2x = 16) is an economically and nutritionally important vegetable crop worldwide [1]. The health benefits of onion are due to several functional compounds, including anthocyanins (mainly in red/purple onions), flavanols such as quercetin (mainly in yellow/brown onions), and alk(en)yl cysteine sulphoxides (ACSOs) [2]. Anthocyanins, type of



flavonoid, are water-soluble vacuolar pigments that confer red, blue, and purple colors in horticultural products depending on the pH [3]. Red onions contain four major cyanidin-based anthocyanins; cyanidin 3-glucoside (Cy 3-Glc), cyanidin 3-laminaribioside (Cy 3-Lam), cyanidin 3-malonylglucoside (Cy 3-MaGlc), and cyanidin 3-malonyllaminaribioside (Cy 3-MaLam) [4], and two minor peonidin derivatives, peonidin 3-glucoside and peonidin 3-malonylglucoside [5].

Inheritance of onion bulb colors appears in a complex pattern [6,7]. Previous inheritance studies have reported the presence of six major loci (*I*, *C*, *G*, *L*, *L*2, and *R*) that are responsible for bulb colors [1]. Particularly, the *R* locus and either the *L* or *L*2 locus are complementarily involved in the control of yellow and red bulb colors [7,8], and the *R* and *L* loci were reported to correspond to the dihydroflavonol 4-reductase (*DFR*) and anthocyanidin synthase (*ANS*) genes, respectively [8]. The *DFR* and *ANS* genes were assigned to chromosomes 7 and 4, respectively; using two complete sets of shallot (*A. cepa*) alien monosomic addition lines [9]. Transcripts of the *DFR* gene were seen in red onions but were absent in yellow onions [10], and it was suggested that blockage of *DFR* transcription or translation results in a lack of anthocyanin production in yellow onion [11]. A total of 16 *DFR-A* alleles were identified, and the process for identification of the alleles was reported [12–14]. On the other hand, *ANS* was related to a pink color as well as anthocyanin production in onion [15–18]. However, the genetic inheritance of anthocyanin content in red onion is poorly understood.

Genomic and genetic studies of onion are difficult due to its huge genome size (16.3 Gbp), biennial life cycle, cross-pollinating nature, and high inbreeding depression [1]. For these reasons, the whole genome sequencing of the onion is not yet completed [19]. Despite the difficulties, several studies on genetic linkage mapping and marker development in the onion have been made. A low-density genetic map of the onion, including 14 random amplified polymorphic DNA (RAPD) and 110 restriction fragment length polymorphism (RFLP) markers, was first constructed using 58 F<sub>3</sub> families derived from a single F<sub>1</sub> plant from the cross of 'Brigham Yellow Globe 15-23' (BYG15-23) and 'Alisa Craig 43' (AC43) [20]. An interspecific genetic map of A. roylei × A. cepa was made using 692 amplified fragment length polymorphism (AFLP) markers [21]. In addition, the linkage groups were assigned to the chromosomes of A. cepa L. via monosomic addition lines [22]. A total of 13 markers, including two cleaved amplified polymorphic sequence (CAPS) and 11 single-strand conformation polymorphism (SSCP) markers, were developed from 128 expressed sequence tag (EST) sequences and positioned on the 'BYG15-23' × 'AC43' map [23]. In the same population, 100 new genetic markers were developed from EST sequences and the 'BYG15-23' × 'AC43' map consisting of 14 linkage groups encompassing 1907 cM was constructed [24]. A total of 37 simple sequence repeat (SSR) markers were developed to distinguish between 35 onion cultivars [25], and 56 EST-SSR and four genomic SSR markers were used for genetic diversity analysis of 89 inbred and open-pollinated bulb onions [26].

Next-generation sequencing (NGS) technologies have made it easier to identify a large number of single-nucleotide polymorphisms (SNPs) to develop SNP markers and to construct genetic linkage maps for plant genetics and breeding [27]. A total of 205 markers, including 11 indel, 90 CAPS, and 104 high-resolution melting (HRM) markers, have been developed from NGS data, and a framework linkage map of over 800 cM spanning all chromosomes was constructed in an F<sub>2</sub> population from a cross between the two bulb onions 'Nasik Red' and 'CUDH2150' [28]. The 20 robust single copy SSR markers selected from 166 SSRs were used for the estimation of genetic diversity within and among 24 bulb onion populations [29]. A total of 597 SNPs identified from cDNA libraries between the bulb onions 'OH1' and '5225' were positioned on a genetic map consisting of ten linkage groups, and the map was compared with the 'BYG1523' × 'AC43' map using 223 common SNPs [30]. A total of 54,165 protein-coding genes among 165,179 assembled transcripts totaling 203 Mb were generated with de novo high-throughput RNA sequencing (RNA-Seq) analysis [31]. In addition, 35,505 isoforms, designated as draft reference transcripts (DRTs, version 1.0), were produced using long-read sequencing [32]. The 301 SNP markers based on kompetitive allele specific PCR (KASP) assays were developed using transcriptome sequencing, and two interspecific genetic maps between A. *roylei* and *A. fistulosum* and between *A. cepa* and *A. roylei* were constructed using the SNP markers [33]. From genotyping-by-sequencing (GBS), 175 SNPs and 57 from Fluidigm SNP assays were used for the construction of an onion genetic map, which consisted of eight linkage groups and covered a total length of 1339.5 cM [34]. A total of 1904 SNPs were discovered in 192 Korean short-day onion inbred lines using double digest restriction site-associated DNA sequencing (ddRAD-seq) [35].

In this study, we aimed to construct an onion genetic linkage map using GBS analysis with the previously reported reference gene set and without the reference whole-genome sequence and to identify quantitative trait loci (QTLs) controlling anthocyanin synthesis and content in an  $F_2$  population.

#### 2. Results

#### 2.1. SNP Detection and Genotyping Using GBS Analysis

GBS analysis was carried out with 96  $F_2$  onion plants for SNP detection and genotype identification. In total, one billion raw reads and 101.9 Gbp of sequences were obtained using Illumina HiSeq 2500 paired-end sequencing (Table 1). The raw reads were classified into 96 groups (samples) using the barcode sequences. The average number of reads in each group was 10,075,947. Subsequently, the demultiplexed reads were trimmed by eliminating barcodes, adaptors, and low-quality sequences. The average length of trimmed reads per sample was 77.75 bp, and accounts for 86.2% of the total raw reads (Table 1). The trimmed reads were mapped on the reference gene set of bulb onion (Table 2) [31]. As a result, only 35.5% of the raw reads were mapped and the total number of mapped reads was 358,301,156 (Table 1). The average number of each mapped region was 16,718, and the average depth of each mapped region was 81.42 (Table 1). The average length of the mapped regions was 1,855,555 bp, which covered 0.9141% of the onion reference gene set (Table 1). Finally, a SNP matrix consisting of 96 samples and 8431 SNPs was generated (Table 1). After filtering with a minimum depth of three, less than 30% missing rate, and over 5% major allele frequency, 1625 SNPs were obtained (Table 1 and Table S1).

**Table 1.** Summary of genotyping-by-sequencing data generated by using transcriptome sequences as a reference.

Summary of Illumina Sequencing	Data
Number of plants for multiplexing	96
Total number of raw reads generated	1,008,750,538 (100%)
Total base number of raw reads (bp)	101,883,804,338 (101.9 Gbp)
Total number of demultiplexed reads	967,290,922 (95.9%)
Total number of trimmed reads	869,413,090 (86.2%)
Total number of mapped reads	358,301,156 (35.5%)
Total number of mapped regions	1,604,901
Average depth of mapped region	81.42
Total length of mapped regions (bp)	1,855,555 (1.9 Mbp)
Total length of the reference gene set (bp)	202,991,716 (203.0 Mbp)
Coverage of the reference gene set	0.9141%
Total number of SNPs detected	8431
Total number of SNPs filtered	1625

Table 2. Summary of transcript-assembled contigs used as an onion reference reported by Kim et al. [31].

Number of	Total Length	Minimum	Maximum	Average	N <sub>50</sub>
Assembled Contigs	(bp)	Length (bp)	Length (bp)	Length (bp)	Length (bp)
165,179	202,991,716	200	16,504	1228	1756

A total of 248 primer sets for HRM markers were designed based on common SNPs between the populations SP3B×H6 (in this study) and OH1×5225 [30]. Among them, only 34 were polymorphic (Figure 1). The HRM marker types were clearly separated into three groups: A (SP3B genotype), B (H6 genotype), and H (heterozygous genotype; Figure 1). The markers were positioned widely throughout the genome on chromosomes 1–8. Detailed marker information is listed in Table 3.



**Figure 1.** Melting curves of 34 high-resolution melting (HRM) markers developed in this study. A, marker type of female parent (SP3B); B, marker type of male parent (H6); H, marker type of heterozygote.

Table 3.	List of HRM	markers	developed	in this study.

				SP3B×H6 Map				OH1×522	5 Map <sup>z</sup>	Transcript ID <sup>y</sup>
No.	Chr. No. <sup>x</sup>	Position (cM)	Marker Name	Forward Primer	Forward Primer Reverse Primer H6		SP3B	Chr. No. <sup>x</sup>	Position (cM)	AC.Combine.Assembly.v.1.0
1	1	23.1	i34152_369-HRM	TCCACATATCTCATATTGCGCTCA	CTTTGGCTTAACTTACCCGATTAC	G	А	1	8.7	AC.Combine.Locus_5700
2	1	63.6	i37206_320-HRM	CCGGTTGTGGTTGGTCGAA	ACAAGTTAGTGGCACGTTACAAAA	G	Т	1	59.0	AC.Combine.Locus_9298
3	2	39.6	i26238_573-HRM	ACAAACCTTATGCAGATACACTCA	GCAACATCAAAAGCTCCCCATC	Т	С	2	67.3	AC.Combine.Locus_14118
4	2	55.4	i26198_779-HRM	TTCTATTACCGGAGCTGTAGTTGG	CAAATGCAATATCTCCAAGGGCTT	G	А	2	95.5	AC.Combine.Locus_9799
5	2	82.8	i30225_1161-HRM	GAAGGGACAGTTCAAGGTAGTAGG	TCTCAAATTCCTTCTCCAACTTCA	G	А	2	154.5	AC.Combine.Locus_7495
6	2	96.9	i32865_1404-HRM	TAGTCAGAATCTTCCTCTCCTGGT	AGTGGAGGAAGATGAAGAAGTTGA	Α	G	2	193.2	AC.Combine.Locus_19254
7	2	100.7	i32416_685-HRM	AGCAATGAAGTACGATTTACAGCA	TGAAGAAGAACCCTCCAACGTTAT	Т	С	2	203.3	AC.Combine.Locus_17664
8	2	116.5	i33538_1298-HRM	AATCGCCATTAGAAAGCTTTACCG	TACACTAAACCCTACAAACGTCGA	С	G	2	217.9	AC.Combine.Locus_250
9	2	126.2	i26131_2020-HRM	GCTTCTTTGGCCCCATATTCAAG	CATTTGCATAATGTGAGAAAGCGC	Т	С	2	227.0	AC.Combine.Locus_1772
10	3	0	i35099_237-HRM	GAAGGATGCTGGTAAGAGGTCTAC	ATTATCCAAACCTGTACCCGTGAA	С	Т	3	0.0	AC.Combine.Locus_31460
11	3	20.2	i39498_201-HRM	AAGAGTTGGGTGTGAAAGGAGATT	CCTGTGTTGAGATTTGGGGATTTC	Т	С	3	12.7	AC.Combine.Locus_89589
12	3	25.8	i33531_1155-HRM	CCTTATGCAGATTCACCATGGAAG	CGGATCTCGTTTAACAGTGGAAAG	Т	С	3	12.7	AC.Combine.Locus_14239
13	3	39.2	i35038_601-HRM	GACTTGGAGTGCAGTTGAGAC	AATCATCGGGCCTCAATGTTCAA	G	А	3	25.1	AC.Combine.Locus_14173
14	3	100.9	i26005_1583-HRM	CAGAGATCTCAACTTGTTCCCTGA	ATTGCATACCTCGAATCGCCTTTA	Α	G	3	174.0	AC.Combine.Locus_9082
15	4	0	i29163_2080-HRM	TTCAGTAAACAAAAGATCGGCTGA	AAATCGGCCATCTTATTGTCTCCA	G	А	4B	0.0	AC.Combine.Locus_8343
16	4	26.2	i26442_1225-HRM	ACATTCTTCAAAGCGGTAACAACC	CAGTCATATACACCTTTATGCAAGT	Α	G	4A	28.3	AC.Combine.Locus_1490
17	4	54.3	i26526_748-HRM	AGGAGGTAATGCACTGATTATTTGT	TGCACAATTGAGAGAAGGTGTTTT	А	G	4B	52.4	AC.Combine.Locus_10803
18	4	62.0	i32123_1465-HRM	CACGAATCCATAAGAGTTATCGCA	TGATCAGGGCTAGGAAAGTTTGAT	Т	С	4B	52.4	AC.Combine.Locus_5789
19	5	68.6	i25881_1343-2-HRM	TTCTGACAATTTGACCGGTTGAAG	CGCGGTTACTCAAGGTTTAAGATT	Т	С	5	59.0	AC.Combine.Locus_3681
20	5	69.1	i25881_1343-1-HRM	CCATCCTGAACACGATAAACCTTC	GATTAGGAGTTTGGCTTTGCTGTG	С	Т	5	59.0	AC.Combine.Locus_3681
21	5	85.6	i29728_1131-HRM	CACAAAGGGGAATCAATAATCGCA	GCCTGCTCTTGGAACTGATAAAAT	Т	С	5	119.4	AC.Combine.Locus_2597
22	5	112.1	i30593_868-HRM	TAAAGACCACAACAGACTCGTTCA	TTGGTTAAGGGAGTCTATGTGAGC	Т	С	5	178.6	AC.Combine.Locus_70708
23	5	115.2	i36364_683-HRM	GAACCCGCCTAAGAACCAGAA	TTCATCCTCGGACTGTCTACTAGA	G	А	5	176.4	AC.Combine.Locus_24909
24	5	118.4	i29592_700-HRM	CTTCTAGAGTTGGTGTTGTGTCCA	ACTCTATGCAAACTTCACCTGAGA	G	С	5	178.6	AC.Combine.Locus_4560
25	6	54.8	i30880_1388-HRM	CGTTGGAAGATTATGTTCATCGCA	TTGGCTGCAGTGAAGTAGGTATAG	С	А	6B	9.3	AC.Combine.Locus_8405
26	6	73.3	i35768 1013-HRM	GACATGCCGCAATCCAAGATTAG	CGGTAGATGGTGAAATTTGTGTCA	Т	С	6B	30.2	AC.Combine.Locus 37095
27	6	91.1	i32739 152-HRM	AAACGGCCATCTTGAAGCAATAGA	GCAAAACTTGGTCAGATAGAGAGC	G	А	6B	41.0	AC.Combine.Locus 12004
28	6	91.7	i36782 698-HRM	GCATGTTGATAGGAATTCGAATGC	GTGTTGTCTTGTTCTCGTGGTTC	Α	Т	6B	44.3	AC.Combine.Locus 15991
29	7	15.6	i39918 357-HRM	ATAACCTCTTCTCAATTCGAACTTC	TCCGATCCTCAATGACGACAATAA	С	G	7	39.1	AC.Combine.Locus 48105
30	7	38.8	i29101 1894-HRM	CATACCAACCTGCACACTTAAACA	GTACCATAGCGACATCCTATAGCC	Α	G	7	92.6	AC.Combine.Locus 854
31	7	43.4	i28923 2628-HRM	TACTATGGGAATTAGCTACGATGC	AACCGTCTATCCTGGAACCCTA	С	Т	7	94.8	AC.Combine.Locus 51
32	8	18.2	i31126 1315-HRM	ACTCTACTTGATGTTCAGTGTGGC	CTTGTCATCATCTTTCCCTAGGCT	Т	С	8	18.2	AC.Combine.Locus 2785
33	8	22.0	i30907_420-HRM	TGGCTCTACTGGGGATTTGTTAAA	CACTCGGCAAATATCCCTGGTAG	С	Т	8	15.4	AC.Combine.Locus_65044
34	8	66.9	i31261_1350-HRM	GTCCCCTAGAAACAGATCTCCAAC	CGACTGTGACTTTTCGGGAATTTA	А	С	8	69.4	AC.Combine.Locus_815

<sup>z</sup> Map information originated from the results of Duangjit et al. [30]. <sup>y</sup> Transcript ID information originated from the results of Kim et al. [31]. <sup>x</sup> Chr. No., chromosome number.

## 2.3. Construction of an Onion Genetic Linkage Map

An onion genetic linkage map consisting of 319 GBS-based SNPs and 34 HRM markers on eight chromosomes was constructed with a total genetic distance of 881.4 cM (Figure 2, Table 4 and Table S2). The number of markers on each chromosome ranged from 36 to 64 with an average of 44, and the average marker interval was 2.5 cM (Table 4). The shortest and longest chromosomes were 7 and 5, with genetic distances of 73.9 cM and 142.8 cM, respectively (Table 4).

Chromosome No.	Length of Linkage Maps (cM)	Total Number of Markers (A+B)	Number of SNPs Resulting from GBS (A) <sup>z</sup>	Number of HRM Markers (B) <sup>y</sup>
1	122.5	36	34	2
2	127.9	53	46	7
3	134.1	42	37	5
4	94.5	38	34	4
5	142.8	45	39	6
6	111.3	64	60	4
7	73.9	38	35	3
8	74.3	37	34	3
Total	881.4	353	319	34
Average	110.2	44	40	4

Table 4. Summary of the onion genetic linkage map constructed from an F<sub>2</sub> population of SP3B×H6.

<sup>z</sup> GBS, genotyping-by-sequencing. <sup>y</sup> HRM, high-resolution melting.

## *Plants* **2020**, *9*, 616

SP3BxH6-C1	OH1x5225-C1	SP3BxH6-C2	OH1x5225-C2	SP3BxH6-C3	OH1x5225-C3	SP3BxH6-C4	OH1x5225-C4A
0.0 146898.4_2053 4.8 6.1 154622.7_433 154622.1_915 16.4 1754622.9_1331 17.6 173347.1_772 9.0	139194_488 138152_119 130803_958 115247_232 134225_997 132522_1235 13425_997 132522_1235 6.0	0.0 183602 1.384 1.1 1.1 1.385 1.1 1.385 1.1 1.385	127223_722 140509_271 136288_410 135144_168 129784_1688 130750_1375 11.6 137757_220 12.1	0.0 i35099 237-HRM	i35099         237         0.0           i29975         1187         2.9           i29680         142         3275           i33275         395         4.0           i40425         522         5.6           i39488         2011         5.6	0.0 5.7 757513.1_314 7.0 7.8 7.8 7.8 7.6 7.6 7.8 7.6 7.6 7.6 7.8 7.6 7.6 7.7 7.5 7.5 7.5 7.5 7.5 7.5 7.5 7.5 7.5	131593_1051 0.0 131622_435 140592_178 136605_668 4.9
10.3 C 126934.1_509 16.2 T2576.1_702 22.8 T277894.1_1223	130381 1487 130381 1487 130385 121 130355 121 121293 730	13.4 16.3 17.0 13.4 16.3 14.105.1_458 17.0 13.682 14.105.1_458 17.0 13.682 14.105.1_458 17.0 13.682 14.105.1_458	i39106_393 i27567_733 i35692_495 i29603_232 i34018_317	14.5 14.5 17.2 18.4 14.5 14.3994.1_564 17.3994.1_514 20.2 139498 201-HRM	134929_648 132712_566 133783_1096 130297_1692 130724_1686	10.7 13.5 13.5 13.5 13.5 13.6 13.5 13.6 1	133172_344 138604_268 17.3
23.1 28.8 31.4 73057.1 659 31.4 73057.1 935 73057.1 935 73057.1 935	i41415_239 i26865_718 i30061_1069 i25793_1638 i31517_1616 29.9	23.0 24.4 T50753.1_651 27.9 T69038.1_385 32.1 T51729.1 785	i41606_421 i28959_1153 i35596_264 i28746_720 i28434_3261	25.8 133531 1155-HRM 30.3 T14116.1 808 30.6 T14116.1 808	i30333_269 i33531_1155 i28424_1060 i34021_1046 i32617_1476 13.3	23.7 T6675.1_952 26.2 126442 1225-HRM 27.7 T3008.2_312	i26442_1225 i28762_702 28.3
35.8 T55716.1_42	132795_827 128682_2145 131711_1395 139994_602 132065_872 49.4	33.7 37.7 39.6 41.9 72493.3_462 72493.3_462	136444_7101 132786_424 130687_13361 141682_224 142489_195 40.6	34.9 T17577.1_666 39.2 135038 601-HRM 40.8 T21980.1_6359 41.4 T21980.1_6458	i35170_582 i31068_1490 i33256_667 i31416_1679 i29611_2140	36.5 37.4 41.5 T87489.1_418 T87489.1_352 T2203.1_2751	i19902_1078 40.0
46.9 T9254.1_513 49.2 T85713.2_1767 50.8 T85713.2_1736	127537_659 129002_461 129456_1102 134700_1097 131228_709 130515_1420 145466_135 13128_554 57.9	43.7 Tē1088.1_399 44.2 Tē1088.1_344 47.8 Tī308.1_344 49.2 Tī348.3_871 50.1 T88053.1_374 55.4 T6618.1_274 1.375 1.374 1.374 1.375 1.375 1.374 1.375 1.37	140703_447 41.2 130461_1472 47.3 131349_1438 138139_314 54.3 130026_1731 56.6 138154_103 56.3 133279_237 59.4 13144_295 69.4	43.8 T80871.1_463 50.4 T30237.1_213 51.3 T71221_328 53.8 T71212.1_328 58.1 T71212.1_328	13094-007 128317_2488 - 19.0 128347_3041 13665_1051 135322_1054 135404_121 12754_547 135404_121 12754_547 135404_121 12754_547 135404_121 12754_547 135404_121 12754_547 135404_121 12754_547 135404_121 12754_547 12755_547 12755_547 12755_547 12755_547 12755_547 12755_57 12755_5755_57 12755_575757 12755_575757 1275557 1275557 12755757 12755757 12755757 1275575757 127557575757 1275575757575757575757575757575757575757	50.4 50.9 105338.1_1123 105338.1_1123 105495.1_228 54.7 10552.7 10551.7 10552.7 10551.7 1055	130046_1029 c00160_1169 i28182_1158 i39401_224 55.1 55.9 55.7
62.5 63.6 66.1 73087.1_623 137206_320-HRM 736702.1_112 87.4 7245641579	133053_287 137063_872 137206_320 131077_1018 131807_1018 131807_1018 131807_1018 131807_1018	57.8 60.5 61.0 61.0 61.8 742148.1_952 61.0 742148.1_952 61.0 742148.1_959 64.4 750608.1_1416	133051_1252 132454_206 126238_573 132826_701 67.8 107991_416	60.4 61.9 63.4 170601.1_485 63.4 170601.1_510 65.0 159117.1_296 66.9 17272750.1_788	131015_812 135038_601 133343_325 132375_266 031357_109	56.4 58.2 60.4 125396.9 1284 62.0 171599.1 766 125396.9 1284 125396.9 1284 171599.1 766 1284 125396.9 1284 171599.1 766 125395.9 1284 125595.9 1285 125595.9 1285 125595.9 1285 125595.9 1285 125595.9 1285 125595.9	OH1x5225-C4B
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	c00676_1004 129681_1091 129102_2197 136562_876 12925_106_105 1292561_105		103354_1001 128524_1455 141226_581 132128_1041 132128_1041	134.1 T44824.1_318	128422_1226 116345_1005 134054_350 135180_158 130362_1460		137023,2691 137962,290 119574_601 132829_1057 144683_192 132854_0731
	140760_164 128777_484 c00534_1173 139438_623 131626_574 160.6 131626_574		131250_1678 133705_468 130965_1185 133142_579		H3361_292 - 134830_369 L 133431_426 L 130865_1200 L c00187_695 L 130.1		137385_830 134670_368 126045_1046 121519_664 13321_0001
	178.2		129809_387 17237_4883 19682_515 133533_668 134922_1015		131710_474 130509_1016 130025_259 134256_531 130453_1365 130453_1365		131392_1360 135268_1082 138580_584 134748_190 109899_661
	137443_625 137419_329 134690_1121 139769_529 184.4		112268_1682 130495_450 131903_969 131878_315 175.1		127696 6001 130363_1184 137451_264 135214_301 133232_1046		129008-4421/ 131879_649
			137213_477 192.6 132865_1404 190.2 131888_430 195.5 132695_459 199.5		125093_2627 126005_1583 131763_1091 134535_1112 130437_499		i36493_410 i32386_133
			132416 685 203.3 136002_905 204.6		128607_1011 122876_134 136406_986 144192_357 133810_581 181.0		i31300_1079 132.3 i30977_551
			131661_1304 136626_938 120252_1096 135211_728 135211_728 217.9		i34825_1197 - 182.1 i32926_115 - 183.8 i30424_1389 - 184.3 i42089_316 - 185.4 i27361_1127 - 185.4		141344_259 133.4 129242_1264 138.7 128561_1513 143.9
			130535 1298 130019_1639 136165_116 126131_2020 222.5 226.5 227.0		137574_383 142169_329 132949_1292 132969_715 132969_715 129299_806		126540_301 145.5 19696_1190 149.2 141409_219 131223_973 152.4 130703_7691
					i33627_701 i25255_1373 i32390_1451 195.1		155.8

Figure 2. Cont.



**Figure 2.** Comparison of two onion genetic linkage maps, the SP3B×H6 map constructed in this study and the OH1×5225 map developed by Duangjit et al. [30]. Bar left or right number, map position (centi Morgan, cM); bar left or right name, marker name; underline, common marker; -HRM in marker name, HRM marker; dotted line, connection between the same transcript-based markers.

## 2.4. Comparison of the SP3B×H6 and OH1×5225 Onion Genetic Linkage Maps

The SP3B×H6 genetic linkage map generated in this study was compared with the previously reported onion reference genetic map for OH1×5225 to assign each linkage group to the corresponding chromosome (Figure 2). First, through a BLAST search with the mapped transcript sequences, only seven common transcripts were identified; including three (i33531\_1155, i35038\_601, and i31357\_1109) on chromosome 3, one (i37258\_745) on chromosome 5, two (i30848\_646 and i28276\_1535) on chromosome 6B, and one (i31126\_1315) on chromosome 8 (Figure 2). Second, a total of 34 HRM markers were developed using SNPs derived from common transcripts (Figure 1 and Table 3). These markers enabled the comparison between SP3B×H6 and OH1×5225 (Figure 2).

## 2.5. Identification of a Major QTL for Anthocyanin Synthesis of Onion Bulbs

Only 69 bulbs were harvested from 96  $F_2$  onion plants due to cultivation problems, which were segregated into 51 red bulbs and 18 yellow bulbs (Figure 3), fitting to the segregating ratio of 3:1 (red:yellow; Table 5). This shows that the red bulb color is caused by the expression of a single dominant gene and yellow bulb color results from homozygous recessive alleles of the gene. QTL analysis using these data revealed a major QTL, *qAS7.1*, for anthocyanin synthesis in the onion (Table 6). This QTL was identified at the 13.8 cM position on chromosome 7 with a logarithm of odds (LOD) score of 9.19 and a phenotypic variance of 87.61% (Table 6). The segregation of red and yellow bulbs was completely consistent with the genotype of the closest marker (T25488.1\_1462) to *qAS7.1* (Figure 2 and Table S3). In the marker, the homozygous genotype of SP3B led to yellow bulbs, whereas the homozygous genotype of H6 or the heterozygous genotype caused red bulbs.



**Figure 3.** Bulb colors of 69  $F_2$  individuals derived from a cross between *Allium cepa* 'SP3B' and 'H6'. Numbers, No. of  $F_2$  individual; R, red color; Y, yellow color.

Population	Generation	Numbe	er of Onion Plar	Expected	N <sup>2</sup> 17 1	n Valuo	
ropulation		Red Bulb	Yellow Bulb	Total	Ratio	X <sup>2</sup> Value	<i>p</i> value
SP3B×H6	F <sub>2</sub>	51	18	69	3:1	0.0435	0.835

Table 5. Segregation analysis of onion bulb colors in an F<sub>2</sub> population of SP3B×H6.

**Table 6.** Summary of significant quantitative trait loci (QTLs) for anthocyanin synthesis and content identified in the  $F_2$  onion population of SP3B×H6.

Trait	QTL	Chr.	Marker Interval	QTL Peak Position (cM)	Additive Effect	Dominance Effect	R <sup>2 z</sup> (%)	LOD <sup>y</sup> Value	LOD Threshold <sup>x</sup>
Anthocyanin synthesis	qAS7.1	7	T25488.1_1462-i39918_357-HRM	13.8	-0.9573	0.2401	87.61	9.19	5.3
Anthocyanin content	qAC4.1 qAC4.2	4 4	T57513.1_314-T53764.1_356 T84695.1_220-i32123_1465-HRM	7.0 62.0	-0.0299 -0.0399	-0.0513 -0.0335	19.43 26.28	3.26 3.03	3.0 3.0

 $^{z}$   $R^{2}$ , proportion of variance explained by the QTL at the test site.  $^{y}$  Logarithm of the odds (LOD).  $^{x}$  LOD threshold was determined with a 1000 times permutation test.

## 2.6. Identification of Two QTLs for Anthocyanin Content of Onion Bulbs

Anthocyanin content of 51 red bulbs in the F<sub>2</sub> population ranged from 0.0098 to 0.5061  $\mu$ g × 100 mg<sup>-1</sup> (Figure 4). The average anthocyanin content was 0.0994  $\mu$ g × 100 mg<sup>-1</sup>, and the average standard deviation was 0.0133  $\mu$ g × 100 mg<sup>-1</sup>. This continuous variation of anthocyanin content indicates that it is quantitatively controlled (Figure 4). Using this data, two significant QTLs, *qAC4.1* and *qAC4.2*, for anthocyanin content of onions were identified by a QTL analysis (Table 6). The QTLs were found at 7 and 62 cM on chromosome 4 with LOD scores of 3.26 and 3.03 and *R*<sup>2</sup> values of 19.43% and 26.28%, respectively (Table 6). The negative additive effects on anthocyanin content were derived from the SP3B genotype and observed in both QTLs (Table 6). A GBS-based marker, T35733.1\_806, and an HRM-based marker, i32133\_1465-HRM, were the closest markers to *qAC4.1* and *qAC4.2*, respectively (Figure 2 and Table 6). For both markers, the homozygous paternal genotype (B) had the highest total anthocyanin content (0.18  $\mu$ g × 100 mg<sup>-1</sup> in T35733.1\_806 and 0.19  $\mu$ g × 100 mg<sup>-1</sup> in T5789-1-C4; Figure 5A,B). The onion lines with both paternal alleles for the markers also showed the highest total anthocyanin content (0.31  $\mu$ g × 100 mg<sup>-1</sup>; Figure 5C).



Figure 4. Total anthocyanin content of 51 red bulbs in the F<sub>2</sub> population of SP3B×H6.

![](_page_10_Figure_1.jpeg)

**Figure 5.** Comparison of the average total anthocyanin content according to genotypes for T35733.1\_806 (**A**) and i32123\_1465-H (**B**) markers and their combinational genotype (**C**). A, genotype of female parent (SP3B); B, genotype of male parent (H6); H, genotype of heterozygote.

## 3. Discussion

The whole-genome sequence of the bulb onion is not yet made public. Nevertheless, we successfully constructed an onion genetic linkage map using a GBS analysis with the reference of transcriptome sequences (Figure 2). There have been a few reports on the onion genetic map construction using NGS technologies. Baldwin et al. [28] reported 195 molecular markers including 11 Indels, 90 CAPSs, and 104 HRMs derived from NGS data, and Duangjit et al. [30] generated 597 SNP markers from transcriptome sequences using the KASP platform. Jo et al. [34] developed an onion genetic map using reference-free GBS analysis, but only 175 SNPs were mapped. We mapped a total of 319 SNPs in this study, divided into eight linkage groups covering a genetic distance of 881.4 cM (Figure 2 and Table 4). This is the first paper that reports the construction of an onion genetic linkage map using GBS analysis with a reference transcriptome sequence. This method will be useful for onion genetic mapping until the whole genome sequence is released.

The onion genetic linkage map of SP3B×H6 was compared with the previously reported genetic map of OH1×5225 using common SNP markers (Figure 2) [30]. The 34 developed HRM markers were widely distributed throughout the genome (Figure 2 and Table 3). All the linkage groups of SP3B×H6 were assigned to the corresponding chromosomes of OH1×5225 (Figure 2). By doing so, we were able to compare the positions of the QTLs to those detected by Duangjit et al. [36].

Segregation analysis of red and yellow bulb colors revealed the presence of one dominant gene responsible for red color through anthocyanin synthesis (Figure 3 and Table 5). Additionally, QTL analysis for anthocyanin synthesis identified only one major QTL, *qAS7.1*, on chromosome 7 with a high  $R^2$  value of 87.61% (Table 6). In previous studies, El-Shafie and Davis [7] proposed that red bulbs are conditioned by dominant alleles at the *R* and *L* loci, and Kim et al. [10,16] suggested that the *R* locus is *DFR* and the *L* locus is *ANS*. These genes were proven to be complimentarily involved in the control of red and yellow bulb colors using molecular markers [10–12,14,16,18]. In addition,

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hybridization analysis using alien monosomic addition lines suggested that the *DFR* and *ANS* genes are located on onion chromosomes 7 and 4, respectively [9]. In this study, *qAS7.1*-linked marker (T25488.1\_1462) cosegregated with bulb colors (red and yellow; Table S3). These results imply that the strongest candidate gene for the QTL *qAS7.1* is *DFR*. However, *DFR* was not possible to be positioned in this map because a marker for the gene was not developed. We suggest further research on marker development for *DFR* gene to clarify the assumption.

The distribution of anthocyanin content in  $F_2$  onion bulbs suggests the trait is quantitatively controlled (Figure 4). QTL analysis for anthocyanin content of onion bulbs revealed two significant QTLs, *qAC4.1* and *qAC4.2*, on chromosome 4 (Table 6). In a previous study, Duangjit et al. [36] identified four QTLs on chromosomes 1, 4, and 8 for anthocyanin concentration and intensity of the red bulb color using segregating haploid progenies of the onion derived from a cross between OH1 (yellow) and 5225 (red). The QTL on chromosome 4 was closely linked to the three markers c00160\_1169, i26182\_1158, and i39401\_224, which were positioned between 55.9 and 56.7 cM (Figure 2) [30]. It might also correspond to the QTL *qAC4.1* since they are located in a similar position (Figure 2). In this study, we additionally found the QTL *qAC4.2*, which was not detected in the previous study, and no QTLs identified on chromosome 1 and 8 (Table 6). The *L* locus was proposed to encode the *ANS* gene, which is located on onion chromosome 4 [9,16], and Khar et al. [8] reported an additional locus (*L2*) on chromosome 4 linked to the *L* locus that also interacts with the *R* locus to regulate red bulb color. Therefore, the QTLs *qAC4.1* and *qAC4.2* need to be compared with the *L* and *L2* loci.

The two markers (T35733.1\_806 and i32123\_1465-H) were closely linked to the QTLs (*qAC4.1* and *qAC4.2*), respectively (Table 6). The genotypic analysis of the markers showed that the homozygous paternal genotype (B) had the highest anthocyanin content and heterozygous genotype (H) was similar to the homozygous maternal genotype (A; Figure 5A,B). These results suggest that both QTLs are recessive genes. In addition, simultaneous homozygous paternal genotype markers (B and B) showed exclusively high anthocyanin content (Figure 5C). This result means that the two QTLs have complementary interaction. Hence, these markers are believed to be very useful for marker-assisted selection for high anthocyanin content in onion breeding.

#### 4. Materials and Methods

## 4.1. Plant Materials

An  $F_2$  segregating population consisting of 96 individuals was used to construct an onion genetic map and identify QTLs for anthocyanin synthesis and content. The population was generated by self-pollination of an  $F_1$  hybrid crossed between an inbred onion line with yellow bulb (SP3B) as a maternal line and a short-day type doubled haploid (DH) onion line with red bulb (H6) as a paternal line. The plants were cultivated in the open farm fields of Chonnam National University (Gwangju, South Korea) from October 2017 to June 2018.

## 4.2. Phenotyping of Bulb Color

Phenotypes of anthocyanin-presence and -absence were discriminated by visually observing bulb color; red and yellow bulbs indicate anthocyanin presence and absence, respectively. These phenotypic data were used to identify the position(s) of the gene(s) controlling anthocyanin synthesis.

## 4.3. Assessment of Anthocyanin Content

Total anthocyanin content of the  $F_2$  onion bulbs was assessed according to the method described by Shin et al. [37]. Anthocyanin extraction was performed as follows: the twelfth piece of bulb per each sample was crumbled in a mortar with liquid nitrogen. Of the bulb powder 100 mg was placed in a 2.0 mL microcentrifuge tube with 600  $\mu$ L of extraction buffer (methanol containing 1% HCl), incubated for 6 h at 4 °C in dark, and then centrifuged at 4 °C for 5 min at 13,000 rpm using a centrifuge (Hanil Scientific Inc., Gimpo, Korea). A 600- $\mu$ L aliquot of the supernatant was transferred to a new 1.5-mL microcentrifuge tube, and 200  $\mu$ L of distilled water and 200  $\mu$ L of chloroform:isoamyl alcohol (24:1) were added. The mixture was centrifuged for 5 min at 13,000 rpm at 4 °C, and 750  $\mu$ L was then transferred to a new 1.5-mL microcentrifuge tube. An aliquot of 300  $\mu$ L was transferred to a new 96-well microplate, and absorbances were measured at 530 nm and 657 nm using an Epoch microplate spectrophotometer (BioTek Instruments, Inc., Winooski, VT, USA). The degree of total anthocyanin content was determined by calculating the following function: total anthocyanin content = (A<sub>530nm</sub>) – 0.25 × (A<sub>657nm</sub>) [38]. Total anthocyanin content was assessed five times per sample and averaged.

## 4.4. DNA Extraction

Genomic DNA was extracted from young leaves of each  $F_2$  individual according to the method described by Lee et al. [39]. The DNA was dissolved in 100 µL of distilled water and treated with 0.1 µL of 10 mg·mL<sup>-1</sup> RNase solution (Bio Basic Canada Inc., Ontario, Canada). The DNA concentration was measured using a BioDrop LITE (BioDrop UK Ltd., Cambridge, UK).

#### 4.5. Genotyping-by-Sequencing Analysis

Genomic DNAs from 96 F<sub>2</sub> individuals were used to construct the library for GBS analysis. The GBS library was constructed according to the method by Eun et al. [40] with the exception of double digestion with the two restriction enzymes *PstI* and *MspI*. The pooled GBS library was sequenced using a HiSeq 2500 (Illumina, Inc., San Diego, CA, USA) using the paired-end read method. The raw sequences were demultiplexed into 96 samples and the demultiplexed sequences were trimmed by removing the barcode, the adapter, and low-quality sequences. The cleaned sequences were aligned to the onion reference gene set consisting of 165,197 assembled contigs (Table 2) [31] using the Burrows–Wheeler alignment (BWA) program version 0.6.1-r104 [41]. Raw SNP detection, consensus sequences extraction, and SNP matrix generation were performed according to the method by Eun et al. [40].

## 4.6. High-Resolution Melting Analysis

HRM analysis was conducted according to the method described by Jeong et al. [42] using a LightCycler<sup>®</sup> Real-Time PCR (Roche, Basel, Switzerland). The melting curve was analyzed with High-Resolution Melt software version 1.1 (Roche), and the genotypes were classified into three groups: A (SP3B marker type), B (H6 marker type), and H (heterozygous marker type). The newly developed polymorphic HRM markers were added to the SP3B×H6 map and compared with the OH1×5225 genetic linkage map [30].

## 4.7. Genetic Linkage Mapping

Genetic linkage maps were constructed using the JoinMap version 4.1 (Kyazma B.V., Wageningen, The Netherlands). Only SNPs fitting with the 1:2:1 ratio of the  $\chi^2$ -test were used (Table S2). A logarithm of odds (LOD) score of 3.0 was regarded as the threshold to determine the significant linkage between markers. Genetic map distances (cM) were calculated by the Kosambi mapping function [43]. The final linkage map was created using the MapChart version 2.1 software [44].

### 4.8. Assignment of Linkage Groups to Onion Chromosomes

Common transcripts were used to assign the linkage groups to onion chromosomes. The transcripts of the reference gene set [31] were compared to those of the standard genetic linkage map OH1×5225 [30]. In addition, a total of 248 primer sets for HRM markers were newly designed, which were selected from the SNPs derived from common transcripts between the reference gene set and the previous map OH1×5225.

#### 4.9. QTL Analysis

QTL analysis was conducted using windows QTL Cartographer version 2.5 program [45] with the composite interval mapping (CIM) method. The LOD threshold for significance level (p = 0.05) was

estimated with a 1000 times permutation test. QTL analysis was carried out using two phenotypic data: anthocyanin synthesis (AS) and anthocyanin content (AC). Anthocyanin synthesis indicates the presence or absence of anthocyanin, while anthocyanin content refers to high or low amounts of anthocyanin.

## 5. Conclusions

In summary, we performed GBS and HRM analyses on 96  $F_2$  onion plants and constructed a genetic linkage map with 319 SNPs and 34 HRM markers, consisting of eight linkage groups and covering 881.4 cM with an average marker interval of 2.5 cM. Through QTL analysis, we identified a major QTL, *qAS7.1*, for anthocyanin synthesis and two significant QTLs, *qAC4.1* and *qAC4.2*, for anthocyanin content in the onion. In conclusion, the map information of the transcripts and markers will contribute to complete the onion whole-genome sequencing, and the QTL information for anthocyanin synthesis and content will be useful for molecular marker development for marker-assisted selection (MAS). This will help to facilitate the breeding of bulb onions with higher anthocyanin content.

**Supplementary Materials:** The following are available online at http://www.mdpi.com/2223-7747/9/5/616/s1, Table S1: The SNP matrix generated by GBS analysis, Table S2: Statistics for GBS-based SNP and HRM markers mapped in this study, Table S3: Cosegregation of the SNP marker (T25488.1\_1462) with bulb color in an  $F_2$  population of SP3B×H6.

**Author Contributions:** J.L. conceived the project and wrote the manuscript; Y.C. performed the analysis and made the figures and tables; S.K. provided onion materials and cultivated the onions. All authors have read and agreed to the published version of the manuscript.

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## Abbreviations

AC	anthocyanin content
AFLP	amplified fragment length polymorphism
ANS	anthocyanidin synthase
AS	anthocyanin synthesis
CAPS	cleaved amplified polymorphic sequence
CIM	composite interval mapping
cМ	centi Morgan
ddRAD-seq	double digest restriction site-associated DNA sequencing
DFR	dihydroflavonol 4-reductase
EST	expressed sequence tag
GBS	genotyping-by-sequencing
HRM	high-resolution melting
KASP	kompetitive allele specific PCR
LOD	logarithm of odds
MAS	marker-assisted selection
NGS	next-generation sequencing
QTL	quantitative trait loci
RAPD	random amplified polymorphic DNA
RFLP	restriction fragment length polymorphism
SNP	single-nucleotide polymorphism
SSCP	single-strand conformation polymorphism
SSR	simple sequence repeat

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