RESEARCH REPORT



Alterations in DNA methylation patterns in regenerated Chinese cabbage (*Brassica rapa* ssp. *pekinensis*) plants derived from tissue culture

Hyun-Min Lee¹ · Jee-Soo Park¹ · Yun-Hee Shin¹ · Young-Doo Park¹

Received: 7 February 2020 / Revised: 11 October 2020 / Accepted: 16 October 2020 / Published online: 5 January 2021 © Korean Society for Horticultural Science 2021

Abstract

Plant tissue culture is an essential tool in biotechnology. However, tissue-cultured plants often exhibit variations that are either genetic or epigenetic in origin, termed somaclonal variations. Among these variations, DNA methylation is an important heritable epigenetic modification that plays a role in a wide variety of biological processes, including gene expression. In this study, we performed bisulfite sequencing of regenerated Chinese cabbage (*Brassica rapa* ssp. *pekinensis*) lines to identify DNA alterations induced by tissue culture. Sequencing data from each regenerated line were compared with reference genome sequences, and common differentially methylated regions (DMRs) were detected in the regenerants. To determine changes in expression levels of DMR-containing genes, we performed quantitative reverse transcription-polymerase chain reaction (qRT-PCR) of the target genes and PCR amplification with bisulfite-converted DNA. We identified DMRs between a non-regenerant line and regenerant lines and selected 10 DMR-associated genes that presented annotation information in *Arabidopsis* or *Brassica rapa*. Their expression levels were verified by qRT-PCR to determine the relation between methylation state and gene expression. We observed that genes positioned in DMRs significantly correlated with differential gene expression. We also observed similar methylation patterns in the selected DMRs by PCR-based methylation analysis. The results of this study are a valuable resource for the epigenetic analysis of regenerated lines, especially for Chinese cabbage.

Keywords Bisulfite sequencing · Brassica rapa · Methylation · Regenerated plants · Tissue culture

1 Introduction

Plant tissue culture is a fundamental tool of plant biotechnology that allows the production of large numbers of genetically identical plantlets. This in vitro technology is widely used in various research fields such as the mass production

Communicated by Inhwa Yeam.

Hyun-Min Lee and Jee-Soo Park have contributed equally to this work.

Electronic supplementary material The online version of this article (https://doi.org/10.1007/s13580-020-00310-1) contains supplementary material, which is available to authorized users.

Young-Doo Park ydpark@khu.ac.kr of secondary metabolites and genetic transformation for crop improvement. Plant cells are cultured under sterile conditions and some of them undergo dedifferentiation based on the plant's power of regeneration, called totipotency. The stability of regenerated plant production and gene expression are the most important issues regarding this technique. However, in vitro culture and regeneration often lead to genetic and epigenetic changes, which are referred to as somaclonal variations. Variations derived from tissue cultures have been reported in various crops (Larkin and Scowcroft 1981; Bajaj 1990) and are manifested as changes in chromosome numbers or structures, nucleotide sequence, gene expression, transposon activation, and phenotype (Kaeppler and Phillips 1993; Miguel and Marum 2011). These undesired variations of in vitro-grown plants may compromise the objectives of tissue culture. Therefore, it is necessary to determine the epigenetic variations that can potentially occur in in vitro-cultured plants to study the potential long-term consequences of this phenomenon.

¹ Department of Horticultural Biotechnology, Kyung Hee University, 1732 Deogyoung-daero, Giheung-gu, Yongin-si, Gyeonggi-do, Republic of Korea

DNA methylation is an essential epigenetic modification that involves a variety of biological processes (Niederhuth and Schmitz 2014; Seymour and Becker 2017). It has been described as being involved in gene regulatory mechanisms (Zilberman and Henikoff 2007; Teixeira and Colot 2009; Maunakea et al. 2010; Bucher et al. 2012; Xing et al. 2015; Seymour and Becker 2017), morphological development (Jacobsen and Meyerowitz 1997; Cubas et al. 1999; Soppe et al. 2000; Manning et al. 2006; Hsieh et al. 2009), and agronomic trait formation (Manning et al. 2006; Miura et al. 2009; Quadrana et al. 2014). Changes in DNA methylation patterns are frequently observed in regenerated plants and have been suggested to cause phenotypic variation through the modulation of gene expression (Kubis et al. 2003). Although epigenetic changes are often temporary and may be easily reverted to their normal status, epigenetic inheritance has also been reported in plants (Iglesias and Cerdán 2016). For these reasons, increasingly more studies are now focusing on the epigenetic aspects of somaclonal variation (Kaeppler et al. 2000; Miguel and Marum 2011).

There are three types of DNA methylation according to the sequence context. A cytosine can be methylated when it is located in the following sequences: CG, CHG, and CHH (H can be A, C, or T) (Feng et al. 2010; Law and Jacobsen 2010). Various studies have been carried out to locate CpG loci considered essential for gene regulation, and changes in DNA methylation in promoter and gene body regions affect gene expression and phenotype (Miguel and Marum 2011; Yang et al. 2014; Taiko et al. 2015). Therefore, profiling DNA methylation across the genome is vital to understand the impact of epigenetics (Laird 2010). The hypomethylation within a promoter region allows transcription factors to bind to the DNA strand and transcription to occur, while hypermethylation results in an opposite effect. Epigenetic variations have been assessed by various methods, including restriction fragment length polymorphism (RFLP), methylation-sensitive amplification polymorphism (MSAP), and methylation-specific polymerase chain reaction (MSP) (Müller et al. 1990; Smulders and De Klerk 2011; Coronel et al. 2018). Diverse computational tools and resources for the analysis of DNA methylation have been developed, including next-generation sequencing (NGS) (Bock and Lengauer 2008). These tools and resources enable characterization of genome-wide DNA methylation and methylation statuses at a single-base resolution.

Among the computational analysis techniques, NGS is a powerful tool applied in epigenetic research as well as in genetic analyses due to its high sensitivity, specificity, and scalability. The characterization of genome-wide DNA methylation on a large scale and single-base resolution has been enabled by NGS technology, including whole-genome bisulfite sequencing (WGBS), small RNA sequencing, and chromatin immunoprecipitation sequencing (ChIP-seq) (Laird 2010). Whole-genome DNA methylation analyses have been conducted in plants such as *Arabidopsis thaliana*, *Oryza sativa* (rice), *Populus trichocarpa* (poplar), and *Glycine max* (soybean) (Feng et al. 2010; Schmitz et al. 2013). These techniques have contributed not only to the obtainment of information about differentially methylated regions (DMRs), but also to the study of gene regulation mechanisms at the epigenetic level. In addition, the time required to obtain and characterize DNA methylomes has been reduced, while their accuracy has been improved in comparison to previous methods.

Chinese cabbage (*Brassica rapa* ssp. *pekinensis*) is one of the most important vegetables worldwide. The *B. rapa* reference genome (variety 'Chiifu-401-42') was published in 2011 (*Brassica rapa* Genome Sequencing Project Consortium 2011) and our group has constructed a pseudomolecule genome of *B. rapa* 'CT001' for precise genome research (Park et al. 2019).

In this work, we performed WGBS in a comparative manner between non-regenerant (control) and regenerant lines. DMRs were selected from R_0 , R_1 , and R_2 lines of R_0C22 and R_0C31 and compared to those from a non-regenerant plant; those that were present in the same regions were selected and considered to be regenerant-specific DMR candidates. As DNA methylation in gene body and promoter is knowingly associated with gene expression levels, DMRs located 1-kb upstream of a gene and in its exons were selected for analysis. Our study provides an overview of the DNA methylome patterns in regenerated lines and highlights the importance of an epigenetic perspective on somaclonal variation.

2 Materials and methods

2.1 Plant materials and genomic DNA extraction

Regenerated lines of the Chinese cabbage inbred line 'CT001', which is widely used for tissue culture and plant transformation, were produced as follows. The seeds of 'CT001' were sterilized and germinated in MS (Murashige and Skoog 1962) basal medium. The upper part of each seedling was used as a non-regenerated control line and the hypocotyls were used to induce calluses and shoots. The regenerated lines R_0C22 and R_0C31 were self-pollinated to generate progeny lines. The regenerated lines R_0C22 and R_1C22 , R_2C22 , R_1C31 , and R_2C31) had their genomes sequenced.

Total genomic DNA of the non-regenerant and regenerants was extracted from young leaves using sodium dodecyl sulfate lysis buffer following a modified method described by Dellaporta et al. (1983). The integrity and quality of DNA were evaluated using the Trinean DropSense instrument (Trinean, Belgium) and the PicoGreen assay (Molecular Probes, USA).

2.2 Bisulfite sequencing and mapping

Genomic DNAs of a non-regenerant line, two R_0 regenerants (R_0C22 and R_0C31), and their progeny lines (R_1C22 , R_1C31 , R_2C22 , and R_2C31) were fragmented to 200–300bp sizes and bisulfite-converted using the EZ-DNA Methylation-Gold Kit (Zymo Research, Orange, USA) following the manufacturer's instructions. Bisulfite-converted libraries were constructed using the Nextflex bisulfite-seq kit (Illumina, USA). Fragments were ligated to adaptors with a unique index sequence. The ligated products, with a length of approximately 550 bp, were used as templates for PCR amplification. Quality control (QC) was performed using a Bioanalyzer (Agilent, Santa Clara, USA) instrument and the library was subjected to sequencing using NextSeq 500TM (Illumina, USA).

The raw reads were cleaned by removing adaptor sequences, while reads with more than 10% of unknown bases and low-quality reads were removed using Trimmomatic software (Bolger et al. 2014). High-quality reads with a maximum of 2-bp mismatches were mapped to the 'CT001' pseudomolecule reference sequences (Park et al. 2019) using Bismark (Krueger and Andrews 2011), which employs a three-letter mapping algorithm for bisulfite read mapping with Bowtie2 (Langmead and Salzberg 2012) for recovered read mapping. The outputs were converted into sequence alignment map (SAM)/binary alignment map (BAM) formats and imported to genome browsers to be visualized and directly explored. Using the bisulfite sequencing data, we calculated DNA methylation with sequences that were mapped to a reference sequence with 95% mapping coverage levels. In addition, we only analyzed cytosines that were mapped with a depth of more than nine reads to identify the methylated cytosine among the mapped sites.

2.3 Data analysis

We determined the ^mC density and average methylation level of each line. The ^mC density refers to the number of cytosine methylation in each sequence context of the aligned reads. We calculated each type of cytosine methylation in the regenerated lines. Average cytosine methylation level was calculated based on the ratio between the number of methylated cytosines and total cytosines within a mapped read. Methylation density was determined using the percentage of methylated cytosines in relation to the total analyzed cytosines. The average methylation level of all cytosines was calculated based on the methylated cytosines in relation to the total cytosines present in the 'CT001' pseudomolecule. In addition, the percentage of methylation was measured. For instance, the percentage of methylation per CpG site was calculated by dividing the number of methylated CpG sites by the total number of CpG sites in the CT001 genome.

2.4 Identification of differentially methylated regions (DMRs)

The DSS package (http://bioconductor.org/packages/release/ bioc/html/DSS.html) (Park and Wu 2016) was used to detect DMRs between the non-regenerant and the regenerants, and we selected a raw p value threshold of 0.05. Cytosines within methylation loci that presented an average fivefold coverage were used to calculate methylation levels. The regions where methylation levels differed by more than 10% between the non-regenerant and regenerants were defined as DMRs. DMR calling was performed with each regenerant line. We analyzed the progeny set of R_0C22 (R_0C22 , R_1C22 , and R_2C22) and R_0C31 (R_0C31 , R_1C31 , and R_2C31) with the callDMR function using a P-value threshold of 0.05, a delta of 0.1, and otherwise default parameters. Overlapping DMRs from the two sets were selected and analyzed. In addition, DMRs overlapping among R₀ regenerated lines were investigated using an in-house script.

Genes associated with DMRs of R_0C22 and R_0C31 were sorted individually. Regarding the functional annotation of the genes, enriched terms of their corresponding *Arabidopsis* genes, such as GO terms and UniProtKB keywords, were assigned using the DAVID functional gene clustering tool (Huang et al. 2009) and enrichment *p* values were corrected using the Benjamini–Hochberg method. In addition, expression analyses were performed with The *Arabidopsis* Information Resource (TAIR) ID of the methylation-related genes using the eFP browser (http://bar.utoronto.ca/efp/cgibin/efpWeb.cgi). A homology search was performed using the basic local alignment search tool (BLAST) software.

2.5 Gene expression analysis

Gene expression analyses were performed to analyze a possible correlation between DNA methylation status and expression of genes within the candidate DMRs. The relationship between methylation and gene expression levels in DMRs was investigated in the regenerated lines (R_0C22 , R_0C31 , R_1C22 , R_1C31 , R_2C22 , and R_2C31). We selected 10 DMRs located in the exonic or 1-kb upstream regions of annotated genes with different methylation levels in both regenerant lines: R_0C22 and R_0C31 (Table 5).

Total RNA was isolated from the non-regenerant and the regenerants using the plant total RNA extraction kit (TaKaRa, Otsu, Japan) according to the manufacturer's instructions. cDNA was synthesized in 20-µL reaction mixtures with cDNA synthesis premix (iNtRON Biotechnology, Seongnam, Korea) and under the following conditions: 50 °C for 60 min and 95 °C for 5 min for reverse transcriptase (RTase) inactivation. Flanking sequences of the selected genes within DMRs were identified in the 'CT001' pseudomolecule reference genome sequences, and primers were designed using Vector NTI software (Invitrogen

 Table 1
 List of primer sets for qRT-PCR analysis

Name	Primer	Sequence $(5' \rightarrow 3')$	Expected product size (bp)
RCD1	F ^Z	GAG CGA GAT ACA TTA CGA GG	136
	R	CGA ACT AGG TAT GTC CAC AC	
RCD2	F	CAA GAC GGG AAG TGA GTA CG	120
	R	GGC ACT GGA GAA CAG CGG T	
RCD3	F	GCT AGA CGC AGT TTG AGT TTC	123
	R	CCT CAT CTT GTT CAT CTC C	
RCD4	F	GAT CTT AGC AGC AAA CTC G	111
	R	ACC ATC CTC TCC ACC TCT CT	
RCD5	F	CCT TGA TTT GAA GCG GGT C	104
	R	TTG CTG TGC ATT TAT GTG G	
RCD6	F	GAG GTT AGG CTG TTG AAG G	127
	R	CAT CAT TCG TCG TCT GTT GG	
RCD7	F	CCA AGA CGA TCA CGG ACA AG	136
	R	CTG CTG TAG CCA CCA GAG C	
RCD8	F	GAA GAC ATT CGG GTC GGG	150
	R	CTT GGG TTG GTC ATC AGG G	
RCD9	F	GAC GATA ACA CCA CCA CCG	121
	R	CGA GGA GAA TCT GTT GCG G	
RCD10	F	CCA TCA CCT ATT ATT GTC TCC	129
	R	CCC ATC TTC ATC ATC CTG C	

^ZF, forward primer; R, reverse primer

Table 2List of primer setsfor methylation-specific PCRanalysis

Carlsbad, CA, USA). The primers used for quantitative reverse transcription-PCR (qRT-PCR) are listed in Table 1.

RT-PCR analysis was performed using Maxime[™] i-Star-Taq PCR Pre-Mix (iNtRON Biotechnology, Seongnam, Korea) to evaluate the expression level of genes within DMRs. The qRT-PCR assay was performed using TransStart® Top Green qPCR SuperMix (TransGen Biotech, Beijing, China) with a Rotor-Gene 6000 (Corbett Robotics, Brisbane, Australia) according to the manufacturer's recommended protocol. PCR conditions were as follows: preincubation for 10 min at 95 °C, followed by 40 cycles of 10 s at 95 °C and 30 s at 60 °C. The melting curve analysis of PCR products was performed by increasing the temperature from 60 to 95 °C. Fluorescence intensity data were collected at the end of each cycle and analyzed using the instrument software. The cycle threshold (C_t) value of each sample was used for calculating relative gene expression levels by the $\Delta\Delta C_{\rm t}$ method (Livak and Schmittgen 2001). Actin was used as the endogenous housekeeping gene for normalization.

2.6 PCR-based methylation analysis

To investigate the methylation state of the selected genes, genomic DNA (1 µg) of each line was treated with bisulfite using the EZ DNA Methylation-GoldTM Kit (Zymo research, CA, USA) in accordance with the manufacturer's instructions. PCR was then performed in 20-µL reaction mixtures using hotstart Taq (MaximeTM i-Star-Taq PCR Pre-Mix; iNtRON Biotechnology, Seongnam, Korea). The bisulfite-converted DNAs of the control plant 'CT001', non-regenerated line R_0C0 , R_0 regenerated lines (R₀C21, R₀C22, R₀C24, and R₀C31), R₁, and R₂ progeny lines of R₀C22 and R₀C31 were used as template. Primers were designed using MethPrimer 2.0 (http:// www.urogene.org/methprimer2/) (Li and Dahiya 2002). The primer sequences and amplicon lengths are shown in Table 2. An overview of the methylation-specific PCR (MSP) approach is presented in Fig. S2. PCR conditions were as follows: 5 min at 95 °C, 40 cycles at 95 °C for 30 s, 60 °C for 30 s, 72 °C for

Name	Primer	Sequence $(5' \rightarrow 3')$	Expected product size
RCD1	MF1 ^Z	GTA AAT ATA GTC GAA GAG ATG ACG TA	195
	MR1	TAA ATA AAC CGA AAA CTA TCC CGT	
	UF1	AAA GTA AAT ATA GTT GAA GAG ATG ATG TAT	200
	UR1	TTT AAA TAA ACC AAA AAC TAT CCC ATC T	
RCD10	MF1	GCG TTT TTG TAA TTA TCG ATT AAT AAT ATC	134
	MR1	CAA TAA AAA CTA ACA CTA AAC TCG TT	
	UF1	TGT TTT TGT AAT TAT TGA TTA ATA ATA TTG	132
	UR1	AAT AAA AAC TAA CAC TAA ACT CAT T	

²MF, forward primer for methylation; MR, reverse primer for methylation; UF, forward primer for unmethylation; UR, reverse primer for unmethylation

30 s, and final extension at 72 °C for 10 min. PCR amplicons were loaded onto 1% agarose gel and then visualized under ultraviolet light.

3 Results and discussion

3.1 DNA methylation profiling in the regenerated lines

We conducted WGBS of the genomic DNA of non-regenerant and regenerant lines to analyze the patterns of epigenetic regulation associated with the unintended variation produced by regeneration. On average, 6 Gb of raw WGBS data was generated for each genome (Table S1). The highquality reads with two allowed mismatches were mapped to the 'CT001' pseudomolecule reference genome with Bismark, using Bowtie 2 as the aligner for methylation analysis. Approximately 90% of clean reads could be independently mapped to the reference genome (Table S2). The ambiguously mapped or duplicate reads were removed, and only uniquely mapped reads were retained for further analyses. As a result, an average of 8 million properly mapped paired reads were retained, covering more than 90% of the 'CT001' reference genome with an average depth of 10x. Regarding genome coverage, approximately 96% of cytosines was covered by at least one uniquely mapped read.

DMRs of each regenerated plant were categorized in the CpG, CHG, and CHH contexts (where H corresponds to A, T, or C). The levels of DNA methylation in these three contexts were determined for each region of each regenerated line and compared to the control line R₀C0. DMR calling in regenerated lines resulted in the identification of an average of 36,682,978 methylated CGs (^mCG) (53.9% of all CGs), 13,590,933 ^mCHGs (19.4% of all CHGs), and 11,678,796 ^mCHHs (26.7% of all CHHs) (Fig. 1). The proportion of methylated cytosines was similar to those in studies on soybeans (Shen et al. 2018). For example, CG methylation was the most predominant followed by CHG and CHH methylation (Lister et al. 2008; Schmitz et al. 2013).

DNA methylome profiles of the non-regenerated and regenerated lines are shown in Fig. S1. The methylation percentage of CpG sites in every line was higher than those of CHG and CHH sites. Each percentage was similar among the analyzed lines. In addition, as observed in prior studies in rice and maize, hypomethylation was more common than hypermethylation in regenerants (Stroud et al. 2013b; Stelpflug et al. 2014).

3.2 DNA methylation patterns in the regenerated lines

The chromosomal distributions of DMRs of the regenerants were analyzed (Table S3). The number of DMRs present on

the chromosome was generally similar for every R_0 regenerated line. Subsequent analysis was performed mainly on the DMRs present in the exon and 1-kb upstream of the gene, which was expected to be directly related to the phenotype. DMRs overlapped among R_0 regenerated lines were identified using an in-house script, and their distributions are shown in Table S3. The number of overlapping DMRs in four subjects was significantly lower than the number of DMRs identified in individual subjects.

The methylation changes in tissue culture were frequent, and these changes were often inherited by self-pollinated progenies (Stelpflug et al. 2014). Based on DMR data of the regenerants, the genome-wide DNA methylation of each progeny line was investigated. We identified DMRs in the regenerants of two progeny lines of R_0C22 and R_0C31 . In the R_0C22 lines (R_0C22 , R_1C22 , and R_2C22), we identified 440 DMRs, including 142 DMRs in the CG context, 97 DMRs in CHG, and 201 DMRs in CHH. In the R_0C31 progeny lines (R_0C31 , R_1C31 , and R_2C31), 453 DMRs were identified, with 140 DMRs in the CG, 102 DMRs in the CHG, and 211 DMRs in the CHH context.

The changes in the methylation patterns of both groups were analyzed to verify if they were related to the regeneration process. The proportion of methylated cytosine residues in the CG context was bigger than 40% across all lines. The average DMR length in the R_0C22 progeny line was 285.52 bp for CG, 223.75 bp for CHG, and 300.99 bp for CHH. The average DMR length in the R_0C31 progeny lines was 286.36 bp for CG, 224.63 bp for CHG, and 331.55 bp for CHH. In both progeny lines, DMR length was the longest in the CHH sequence context.

3.3 Analysis of differentially methylated genes

To investigate the relationship between genes with differences in methylation patterns in the regenerated lines, we clustered genes according to DMRs using their corresponding TAIR IDs from the DAVID Bioinformatics resource (https://david.ncifcrf.gov/), adopting the Benjamini-Hochberg method for correction. Table 3 shows results of each gene clustering in both progeny groups of the regenerated Chinese cabbage lines, R₀C22 and R₀C31, including lists of enriched terms and keywords. As a result, we observed that the DMR-associated genes of the R₀C22 lines were mainly related to nucleus, transcription regulation, and sequence-specific DNA binding activity. Functional annotation enriched for DMR-associated genes of the R₀C31 lines showed that they were mainly associated with the endoplasmic reticulum and RNA-directed DNA polymerase activity. However, as the results were not statistically significant, we inferred that genes whose methylation patterns changed during the regeneration process did not have any correlation with each other.



Fig.1 In silico analysis of the methylation patterns of the regenerant-conserved DMRs (RCDs) in the regenerated lines of the R_0 , R_1 , and R_2 generations. Black arrows indicate lengths and directions of

the genes. The green boxes indicate hypomethylated DMRs, and the orange boxes indicate hypermethylated DMRs in the regenerated lines

Among the DMRs identified in both R_0C22 and R_0C31 lines, 10 were located at the 1-kb upstream region of known genes, within a promoter region, and 11 were

located at exonic regions. The genes that overlapped with the promoter and exonic regions of methylated DMRs were related to the secretory protein, zinc finger CCCH

Cluster number	Cluster enrichment score	Category ^Z	Description	Count	p value	Benjamini-Hochberg
R ₀ C22 lines	2.32	UP_KEYWORDS	Nucleus	50	4.96E-04	8.59E-02
		UP_KEYWORDS	Transcription	31	3.70E-03	2.00E-01
		UP_KEYWORDS	DNA-binding	28	5.23E-03	2.11E-01
		UP_KEYWORDS	Transcription regulation	31	2.62E-03	2.12E-01
		GOTERM_MF	(GO:0003700) Transcription factor activity, sequence-specific DNA binding	29	6.02E-03	4.68E-01
		GOTERM_MF	(GO:0043565) Sequence-specific DNA binding	16	3.20E-03	4.88E-01
		GOTERM_BP	(GO:0006355) Regulation of transcription, DNA-templated	34	4.22E-03	7.74E-01
		GOTERM_BP	(GO:0006351) Transcription, DNA-templated	30	8.76E-03	7.87E-01
		GOTERM_MF	(GO:0003677) DNA binding	28	7.83E-02	9.67E-01
R ₀ C31 lines	1.83	GOTERM_CC	(GO:0005789) endoplasmic reticulum mem- brane	10	1.49E-02	4.00E-01
		UP_KEYWORDS	Endoplasmic reticulum	11	1.70E-02	4.78E-01
		GOTERM_CC	(GO:0005783) endoplasmic reticulum	14	1.31E-02	4.90E-01
	1.72	INTERPRO	IPR026960: Reverse transcriptase zinc-binding domain	4	1.00E-03	3.47E-01
		UP_KEYWORDS	RNA-directed DNA polymerase	3	1.83E-02	4.43E-01
		GOTERM_MF	(GO:0003964) RNA-directed DNA polymerase activity	3	2.83E-02	8.86E-01
		UP_KEYWORDS	Nucleotidyltransferase	3	2.64E-01	7.67E-01

Table 3 Functional annotation clustering of DMR-related genes in the regenerated Chinese cabbage lines of R_0C22 and R_0C31 (cluster enrichment score > 1)

^ZOriginal database or resource where the terms come from. UP_KEYWORDS, keywords from UniProtKB; GOTERM_MF, Gene ontology term of molecular function; GOTERM_BP, Gene ontology term for the description of biological process; GOTERM_CC, Gene ontology term for cellular component; INTERPRO, terms from InterPro protein database

domain-containing protein, serine/threonine-protein phosphatase, receptor-like protein kinase, nudix hydrolase, and the trihelix transcription factor.

We focused our analyses on regions with coverage of at least three reads and with consistent methylation levels among the regenerated lines. A total of 36 DMRs were observed in both the C22 and C31 lines; these were designated as "regenerant-conserved" DMRs (RCD) (Table 4). Among them, CT001_A10358000 has DMRs both in CG and CHH contexts in its intron sequence, while CT001 A06227680 and CT001 A07241390 have DMRs in the CHG and CHH contexts in the intron and 1-kb upstream regions, respectively. Briefly, we identified 33 DMR-associated genes in both groups of R₀C22 and R_0C31 progeny lines and expected that the methylation levels of these DMRs might be related to the regeneration process, affecting subsequent gene expression. The DNA sequence of the selected DMRs and their adjacent regions were obtained from the 'CT001' pseudomolecule genome.

3.4 Validation of the selected DMRs

We selected 10 DMRs between the non-regenerant line and the regenerant lines that were located at the exonic or 1-kb upstream regions of fully annotated genes. In silico analysis of the selected DMRs was performed using the 'CT001' pseudomolecule genome browser, which included the bisulfite sequencing data of regenerated lines. We loaded the BAM file of the R_0 (R_0C0 , R_0C22 , and R_0C31), R_1 (R_1C22 and R_1C31), and R_2 (R_2C22 and R_2C31) generations of regenerated lines on the genome browser and compared the methylation status of the selected RCD genes. The CG, CHG, and CHH methylation patterns of each line were compared (Fig. 1). In some cases, the differences in methylation patterns were also identified in contexts other than those expected. For example, RCD1 was expected to bear CG DMRs, but the analysis also showed DMRs in CHG and CHH contexts (Fig. 2). The

CG		CHG		СНН		
Gene	Location	Gene	Location	Gene	Location	
CT001 A02057490	1 kb upstream	CT001 A01003500	Exon	CT001 A02061980	1 kb upstream	
CT001 A02068540	Exon	CT001 A02057460	Intron	CT001 A03095550	1 kb upstream	
CT001 A03108110	Exon	CT001 A02068580	1 kb downstream	CT001 A04144140	Exon	
CT001 A05174100	1 kb upstream	CT001 A03094670	Exon	CT001 A04406000	Exon	
CT001 A05179070	Exon	CT001 A04148480	1 kb downstream	CT001 A06213370	1 kb downstream	
CT001 A06220060	1 kb upstream	CT001 A05411190	Exon	CT001 A06227680	Intron	
CT001 A07234270	1 kb downstream	CT001 A06208390	1 kb downstream	CT001 A08284050	1 kb upstream	
CT001 A08286520	Intron	CT001 A06227680	Intron	CT001 A09332120	Intron	
CT001 A09432250	Exon	CT001 A07241390	1 kb downstream	CT001 A09351750	1 kb upstream	
CT001 A09433360	Exon	CT001 A08280360	Exon	CT001 A10358000	Intron	
CT001 A10358000	Intron	CT001 A08284050	1 kb upstream	CT001 A10372760	Intron	
		CT001 A09312880	1 kb upstream			
		CT001 A09330720	1 kb downstream			
		CT001 A10369640	1 kb upstream			
			1			

Table 4 List of genes within DMRs commonly identified in both progeny groups of R_0C22 and R_0C31 regenerated lines





Fig. 2 The hypomethylation in gene CT001_A02068540. The pattern of the selected DMRs can be visualized through hierarchical clustering of methylation levels for all lines. For each line track, bar height represents the percentage of methylation. The blue arrow and boxes represent the genes. The yellow, purple, and red bars indicate CG, CHG, and CHH methylations, respectively

methylation statuses of 9 out of 10 DMR-associated genes were lower in regenerated lines than in the control lines.

3.5 Correlation between DMR and gene expression

We analyzed whether the expression of DMR-associated genes changed according to the methylation patterns of regenerated lines. We selected 10 DMRs conserved in R_0C22 and R_0C31 and their progeny lines and investigated their DNA methylation levels and gene expression patterns. As mentioned above, gene expression levels were positively correlated with the methylation levels within the transcribed regions (Fig. 3). The expression of genes associated with hypomethylated DMRs in the regenerated lines was generally upregulated. In contrast, the expression of genes associated with hypermethylated DMRs in the regenerated individuals was generally downregulated. The DMRs located at the 1-kb upstream and exonic regions of the selected genes were also analyzed. The annotated genes associated with DMRs included those involved in transcriptional regulation, DNA polymerase activity, and signal transduction functions. In addition, we performed in silico analyses of the differences in gene expression during the regeneration process using TAIR IDs and the Arabidopsis eFP browser (http:// bar.utoronto.ca/efp/cgi-bin/efpWeb.cgi). Six out of ten genes could be analyzed with the eFP browser. The expression levels of the genes tended to increase by 2-4 times during the callus induction process, therefore these genes were considered to be related to this process. In particular, the expression level of A. thaliana subtilase family protein SBT3.3 (AT1G32960) was increased by 16 times after callus induction and this was probably associated with the regeneration process. When compared with 'CT001', the genes were





Fig. 3 Gene expression analysis of 10 selected genes within regenerant-conserved DMRs (RCDs) in the regenerated lines. Expression levels of each DMR gene in R_0 , R_1 , and R_2 generations of R_0C22 and

 R_0C31 were compared with those of inbred line 'CT001' and nonregenerant R_0C0 . Y-axis indicates relative mRNA expression, and bars on the graph indicate the SE of the means (n=3)

For validation of the identified changes in methylation, RT-PCR of the 10 selected DMR-associated genes was conducted using cDNA synthesized from total RNA extracted from each regenerated line and primer sets for the selected DMRs. The amplicon with the expected product size was identified (Fig. S1), and gene expression was examined in non-regenerant and regenerant lines by qRT-PCR using the same primer sets used for RT-PCR (Fig. 3). This analysis revealed that alterations in DNA methylation, either hyperor hypo-methylation, regulated gene expression levels. Most results indicated that regenerated lines exhibited increased gene expression along with a lower methylation level, while a decrease in the methylation status resulted in increased gene expression.

Among the selected genes, *RCD1*, *RCD2*, and *RCD3* were expected to be associated with stress response (Table 5). As shown in Fig. 3, the expression of *RCD1* in regenerants was higher than that in the non-regenerant, indicating that CG hypomethylation in the promoter region and extensive CHG and CHH hypomethylation in the exonic and promoter regions effectively upregulated *RCD1* gene expression. *RCD1* was matched with AT3G07460, encoding a putative transmembrane protein containing the DUF538 domain, and has been reported to respond to various biotic and abiotic stresses in plants (Gholizadeh 2011). AT3G21910 matched with *RCD2* and encodes a putative cysteine-rich repeat secretory protein, DUF26, that exists in three forms in plants: cysteine-rich receptor-like secreted proteins (CRRSPs), cysteine-rich receptor-like protein kinases (CRKs), and plasmodesmata-localized proteins (PDLPs). The expression of genes corresponding to CRRSPs and CRKs increased when exposed to biotic and abiotic stress (Vaattovaara et al. 2019). *RCD3* is matched with AT2G40140, a zinc finger (CCCH-type) family protein that is known to be associated with tolerance to salinity stress and osmotic stress in plants (Han et al. 2014). In *Arabidopsis*, the expression of the corresponding gene, *AtSZF2*, rapidly increases under salinity stress (Sun et al. 2007). Therefore, the increased expression of those genes as a result of hypomethylation was expected in response to various environmental stresses, which occurred during the regeneration process, such as stresses caused by culture media, plant hormones, and reagents used for tissue culture.

In addition, RCD4 matched with the AT4G17250 gene (Table 5), whose expression increased after 37 °C heat treatment in Arabidopsis (Lim et al. 2006). AT2G20440 matched with RCD5, which encodes the gyp1p superfamily protein (Table 5). Its expression changes in relation to meiosis in Arabidopsis, but the exact function of the gene has not been revealed (Libeau et al. 2011). RCD6 matched with AT5G59160 (Table 5), which is a protein phosphatase (TOPP) family gene, also known as protein phosphatase 1 (PP1). Genes of the TOPP family have been reported, to be regulators of plant immunity, but the detailed functions in plants have not been revealed (Liu et al. 2020). The AT2G42070 gene matched RCD8 and is described as Arabidopsis nudix hydrolase (AtNUDX23) (Table 5). It has been reported to be involved in flavin homeostasis of plant cells (Maruta et al., 2012). RCD9 matched with AT1G13450, which encodes transcription factor GT-1 (Table 5). GT-1 has

 Table 5
 List of the selected DMR-associated genes identified in the regenerated lines

			-	-			
	Context	Methylation pattern in R ₀	CT001 ID	Location	Brassica ID	TAIR ID	TAIR ID description
RCD 1	CG	Hypo ^Z	CT001_A02068540	Exon	Bra020698	AT3G07460	Transmembrane protein, putative (Protein of unknown function, DUF538)
RCD 2	CG	Нуро	CT001_A05179070	Exon	Bra031316	AT3G21910	Cysteine-rich repeat secretory protein, puta- tive (DUF26)
RCD 3	CHG	Нуро	CT001_A03094670	Exon	Bra000170	AT2G40140	Zinc finger (CCCH-type) family protein
RCD 4	CHG	Нуро	CT001_A08280360	Exon	Bra021060	AT4G17250	Transmembrane protein
RCD 5	CHG	Нуро	CT001_A09312880	1 kb upstream	Bra036677	AT2G20440	Ypt/Rab-GAP domain of gyp1p superfamily protein
RCD 6	CHG	Нуро	CT001_A10369640	1 kb upstream	Bra002590	AT5G59160	Encodes the catalytic subunit of a Type 1 phosphoprotein Ser/Thr phosphatase
RCD 7	CHH	Hyper	CT001_A02061980	1 kb upstream	Bra033176	AT4G10390	Protein kinase superfamily protein
RCD 8	CHH	Нуро	CT001_A03095550	1 kb upstream	Bra000253	AT2G42070	Encodes a plastid-localized Nudix hydrolase
RCD 9	СНН	Нуро	CT001_A09351750	1 kb upstream	Bra026903	AT1G13450	Encodes GT-1, a plant transcription factor that binds to one of the cis-acting elements, BoxII
RCD 10	CHH	Нуро	CT001_A08284050	1 kb upstream	Bra016340	-	

^ZHypo, hypomethylation; Hyper, hypermethylation

been reported to affect gene expression by binding to BoxII, a cis-acting element present in the upstream promoter region of light-responsive genes (Nagata et al. 2010). As the methylation patterns and the expression of these genes changed in regenerated lines, an association between the genes and the tissue culture process adopted is expected, but further studies are required.

Unlike other RCD genes, hypermethylation and decreased expression of RCD7 were shown in regenerated plants (Fig. 3; Table 5). This showed that DNA hypermethylation was associated with repressed gene expression. Typically, the presence of methylated cytosines within a promoter region reduces gene expression (Taiko et al. 2015). AT4G10390, which matched with RCD7, encodes a kinase superfamily protein that is known to be related to plant growth and development. In Arabidopsis, its expression decreased threefold after treatment with melatonin which is related to plant stress defense (Weeda et al., 2014). Therefore, it can be assumed that the AT4G10390 gene is associated with a decrease in expression related to plant stress defense. It was predicted that the decrease in gene expression of RCD7, due to hypermethylation, was intended to defend against stress created during the regeneration process. In conclusion, the results of this analysis indicated that the regeneration process might affect DNA methylation in the regenerated lines and subsequently affect their gene expression.

Furthermore, the methylation status of the selected RCDs was maintained in DMRs in the progeny lines obtained by self-pollination. This study shows that epigenetic signals, such as DNA methylation and histone modifications, caused by environmental stress in the previous generation are also conserved in the progeny line; this is known as "transgenerational epigenetic inheritance (TEI)". In general, epigenetic signatures are known to be removed from progeny by germline reprogramming in mammals (Heard and Martienssen 2014). However, in plants, epigenetic signatures have been reported to be stably inherited for several generations in various organisms (Hauser et al. 2011).

In Arabidopsis, genes involved in methylation in CG, CHG, and CHH sequence contexts have been reported (Stroud et al. 2013a; Zhang et al. 2018). CG methylation is regulated by methyltransferase 1 (*MET1*) and the plant homolog of mammalian DNA (cytosine-5)-methyltransferase 1 (*DNMT1*) (Kankel et al. 2003). Chromomethylase 3 (*CMT3*) is known to regulate CHG methylation and domains rearranged methyltransferases (*DRM1* and 2) and plant homologs of mammalian *DNMT3* maintain CHH methylation through the RNA-directed DNA methylation (RdDM) pathway (Xie et al. 2004). In addition, it was reported that DNA methylation is regulated by multiple pathways based on studies of mutants of methylation-related genes in *Arabidopsis* (Stroud et al. 2013a). Since Chinese cabbage belongs to *Brassicaceae*, like *Arabidopsis*, it is expected

that DMRs of Chinese cabbage may have been regulated by similar DNA methylation-related genes as in *Arabidopsis*. Therefore, the results obtained in this study can be utilized to study the interplay of genes involved in regulating DNA methylation in Chinese cabbage.

Although the change in methylation pattern between nonregenerants and regenerant was confirmed, the difference in phenotype was not observed. In previous studies in rice (Stroud et al. 2013b) and maize (Stelpflug et al. 2014), most phenotypic variations were observed only in a subset of plants regenerated from tissue culture. Thus, we considered that variation of methylation patterns in the regenerants in this study might not critically affect the phenotype. In a previous study, a significant portion of hypomethylated DMRs identified in tissue-cultured plants was found to be hypomethylated even in the natural state (Stelpflug et al. 2014). Plants display alteration of DNA methylation in response to diverse environmental stress in nature. Accordingly, it was suggested that these DMRs are sensitive to environmental changes, rather than specifically arising because of the tissue culture process.

3.6 Methylation-specific PCR

Different methylation patterns of RCD1 and RCD10 were detected among regenerated lines using methylation-specific PCR (MSP) in which bisulfite-treated DNA was used as a template. For each selected DMR, we designed two primer sets specific to methylated (M pair) and unmethylated DNA (U pair).

MSP data of RCD1 showed that methylated PCR products were observed in 'CT001' and non-regenerated plant R₀C0, while unmethylated PCR products were not (Fig. 4a). On the contrary, the unmethylation of RCD1 was detected from the R_0 regenerated lines and from their progenies. These results showed that RCD1 was methylated in the general condition of B. rapa plants, but it was unmethylated in regenerated lines and the altered methylation status was maintained in R₁ and R₂ generation. In addition, it was revealed that RCD10 was methylated in 'CT001' and R₀C0, as well as regenerated lines, while partially demethylated in the R₁ progeny line of R_0C31 (Fig. 4b). This result also showed that methylation status can be visualized by MSP. The difference in methylation status of RCD10 was not clearly shown, which is expected to be due to the slight change in methylation level in regenerated lines.

MSP is a simple and sensitive PCR-based technique to distinguish unmethylated and methylated DNA (Herman et al. 1996). The methylated primers amplify sodium bisulfite-converted methylated DNA, while the unmethylated primers amplify unmethylated DNA. The MSP method has been performed in diverse organisms to distinguish methylation status in the genome (Khraiwesh et al. 2010; Uthup et al.



Fig.4 Analysis of methylation-specific PCR products amplified by primer sets of RCD1 (**a**) and RCD10 (**b**). CT001, inbred line; R_0C0 , non-regenerated plant; R_0 , R_0 regenerated lines including R_0C21 ,

2011; Mihara et al. 2017). Identification of epigenetic markers can be further used for screening methylation changes in the genome of regenerated lines. In conclusion, these MSP results indicate that the alteration in methylation status might be induced during regeneration or tissue culture, and it can be specifically evaluated by PCR-based methods.

4 Conclusion

Genetic and epigenetic instabilities were often observed in in vitro-cultured and regenerated lines. These phenomena can affect the practical applications of plant tissue culture in various research areas. The epigenetic instability of DNA has been especially suggested to be involved in gene expression control. In this study, we performed WGBS on regenerated lines of the *B. rapa* ssp. *pekinensis* inbred line 'CT001' to uncover DNA methylation changes resulting from the regeneration process in Chinese cabbage. We identified epigenetic mutations in regenerated lines that could have been induced by tissue culture and could be inherited by progeny lines, and expression levels of gene were positively correlated with the methylation levels within the transcribed regions. We also developed epigenetic markers to be used for screening methylation changes in genome of regenerated lines. In this study, we identified the DMRs consistently observed in the

tic instabil- Author's contribution HM Lee and JS Park performed the majority

of the experiment and data analysis, and developed the regenerated lines. HM Lee and JS Park contributed equally to this work. YH Shin contributed to experimental implementation. YD Park designed the experiment and analyzed data. All authors contributed to and corrected the manuscript.

R₀C22, R₀C24, and R₀C31; R₁ and R₂, progeny lines of R₀C22 and

R₀C31. M, methylated PCR products; U, unmethylated PCR products

regenerants and confirmed the variation in methylation

patterns of the selected DMRs and the expression of the

genes containing the DMRs. Further research is needed

on the causes of these epigenetic changes in regenerants

and their progenies, as well as the consequences that may

affect metabolic processes or phenotypes. In conclusion, our findings will contribute to the understanding of epigenetic aspects of somaclonal variation in regenerated lines.

Acknowledgements This work was carried out with the support of the "Cooperative Research Program for Agriculture Science and Tech-

nology Development (Project No. PJ01324601)", Rural Development

Data availability The datasets generated during and/or analyzed during the current study are available from the corresponding author on reasonable request.

Compliance with ethical standards

Administration, Republic of Korea.

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

References

- Bajaj YPS (1990) Somaclonal variation—origin, induction, cryopreservation and implication in plant breeding. In: Bajaj YPS (ed) Biotechnology in agriculture and forestry II, somaclonal variation in crop improvement I. Springer, Berlin, pp 3–48
- Bock C, Lengauer T (2008) Computational epigenetics. Bioinformatics 24:1–10
- Bolger AM, Lohse M, Usadel B (2014) Trimmomatic: a flexible trimmer for Illumina sequence data. Bioinformatics 30:2114–2120
- Brassica rapa Genome Sequencing Project Consortium (2011) The genome of the mesopolyploid crop species *Brassica rapa*. Nat Genet 43:1035
- Bucher E, Reinders J, Mirouze M (2012) Epigenetic control of transposon transcription and mobility in *Arabidopsis*. Curr Opin Plant Biol 15:503–510
- Coronel CJ, González AI, Ruiz ML, Polanco C (2018) Analysis of somaclonal variation in transgenic and regenerated plants of *Arabidopsis thaliana* using methylation related metAFLP and TMD markers. Plant Cell Rep 37:137–152
- Cubas P, Vincent C, Coen E (1999) An epigenetic mutation responsible for natural variation in floral symmetry. Nature 401:157–161
- Dellaporta SL, Wood J, Hicks JB (1983) A plant DNA minipreparation: version II. Plant Mol Biol Rep 1:19–21
- Feng S, Cokus SJ, Zhang X, Chen PY, Bostick M, Goll MG, Hetzel J, Jain J, Strauss SH, Halpern ME et al (2010) Conservation and divergence of methylation patterning in plants and animals. Proc Natl Acad Sci USA 107:8689–8694
- Gholizadeh A (2011) Heterologous expression of stress-responsive DUF538 domain containing protein and its morpho-biochemical consequences. Protein J 30:358
- Han G, Wang M, Yuan F, Sui N, Song J, Wang B (2014) The CCCH zinc finger protein gene *AtZFP1* improves salt resistance in *Arabidopsis thaliana*. Plant Mol Biol 86:237–253
- Hauser MT, Aufsatz W, Jonak C, Luschnig C (2011) Transgenerational epigenetic inheritance in plants. Biochim Biophys Acta 1809:459–468
- Heard E, Martienssen RA (2014) Transgenerational epigenetic inheritance: myths and mechanisms. Cell 157:95–109
- Herman JG, Graff JR, Myohanen S, Nelkin BD, Baylin SB (1996) Methylation-specific PCR: a novel PCR assay for methylation status of CpG islands. Proc Natl Acad Sci USA 93:9821–9826
- Hsieh TF, Ibarra CA, Silva P, Zemach A, Eshed-Williams L, Fischer RL et al (2009) Genome-wide demethylation of *Arabidopsis* endosperm. Science 324:1451–1454
- Huang DW, Sherman BT, Lempicki RA (2009) Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. Nat Protoc 4:44–57
- Iglesias FM, Cerdán PD (2016) Maintaining epigenetic inheritance during DNA replication in plants. Front Plant Sci 7:38
- Jacobsen SE, Meyerowitz EM (1997) Hypermethylated SUPERMAN epigenetic alleles in Arabidopsis. Science 277:1100–1103
- Kaeppler SM, Kaeppler HF, Rhee Y (2000) Epigenetic aspects of somaclonal variation in plants. Plant Mol Biol 43:179–188
- Kaeppler SM, Phillips RL (1993) Tissue culture-induced DNA methylation variation in maize. Proc Natl Acad Sci USA 90:8773–8776
- Kankel MW, Ramsey DE, Stokes TL, Flowers SK, Haag JR, Jeddeloh JA, Riddle NC, Verbsky ML, Richards EJ (2003) Arabidopsis MET1 cytosine methyltransferase mutants. Genetics 163:1109–1122
- Khraiwesh B, Arif MA, Seumel GI, Ossowski S, Weigel D, Reski R, Frank W (2010) Transcriptional control of gene expression by microRNAs. Cell 140:111–122

- Krueger F, Andrews SR (2011) Bismark: a flexible aligner and methylation caller for bisulfite-seq applications. Bioinformatics 27:1571–1572
- Kubis S, Baldwin A, Patel R, Razzaq A, Dupree P, Lilley K et al (2003) The Arabidopsis ppi1 mutant is specifically defective in the expression, chloroplast import, and accumulation of photosynthetic proteins. Plant Cell 15:1859–1871
- Laird PW (2010) Principles and challenges of genome-wide DNA methylation analysis. Nat Rev Genet 11:191–203
- Langmead B, Salzberg SL (2012) Fast gapped-read alignment with Bowtie 2. Nat Methods 9:357–359
- Larkin PJ, Scowcroft W (1981) Somaclonal variation–a novel source of variability from cell cultures for plant improvement. Theor Appl Genet 60:197–214
- Law JA, Jacobsen SE (2010) Establishing, maintaining and modifying DNA methylation patterns in plants and animals. Nat Rev Genet 11:204–220
- Li LC, Dahiya R (2002) MethPrimer: designing primers for methylation PCRs. Bioinformatics 18:1427–1431
- Libeau P, Durandet M, Granier F, Marquis C, Berthomé R, Renou JP et al (2011) Gene expression profiling of *Arabidopsis meiocytes*. Plant Biol 13:784–793
- Lim CJ, Yang KA, Hong JK, Choi JS, Yun DJ, Hong JC et al (2006) Gene expression profiles during heat acclimation in *Arabidopsis thaliana* suspension-culture cells. J Plant Res 119:373–383
- Lister R, O'Malley RC, Tonti-Filippini J, Gregory BD, Berry CC, Millar AH, Ecker JR (2008) Highly integrated single-base resolution maps of the epigenome in *Arabidopsis*. Cell 133:523–536
- Liu Y, Yan J, Qin Q, Zhang J, Chen Y, Zhao L et al (2020) Type one protein phosphatases (TOPPs) contribute to the plant defense response in *Arabidopsis*. J Integr Plant Biol 62:360–377
- Livak KJ, Schmittgen TD (2001) Analysis of relative gene expression data using real-time quantitative PCR and the $2^{-\Delta\Delta CT}$ method. Methods 25:402–408
- Manning K, Tor M, Poole M, Hong Y, Thompson AJ, King GJ et al (2006) A naturally occurring epigenetic mutation in a gene encoding an SBP-box transcription factor inhibits tomato fruit ripening. Nat Genet 38:948–952
- Maruta T, Yoshimoto T, Ito D, Ogawa T, Tamoi M, Yoshimura K et al (2012) An Arabidopsis FAD pyrophosphohydrolase, AtNUDX23, is involved in flavin homeostasis. Plant Cell Physiol 53:1106–1116
- Maunakea AK, Nagarajan RP, Bilenky M, Ballinger TJ, D'Souza C, Fouse SD et al (2010) Conserved role of intragenic DNA methylation in regulating alternative promoters. Nature 466:253–257
- Mihara H, Suzuki N, Muhammad JS, Nanjo S, Ando T, Fujinami H et al (2017) Transient receptor potential vanilloid 4 (TRPV 4) silencing in Helicobacter pylori-infected human gastric epithelium. Helicobacter 22:e12361
- Miura K, Agetsuma M, Kitano H, Yoshimura A, Matsuoka M, Jacobsen SE et al (2009) A metastable DWARF1 epigenetic mutant affecting plant stature in rice. Proc Natl Acad Sci USA 106:11218–11223
- Miguel C, Marum L (2011) An epigenetic view of plant cells cultured in vitro: somaclonal variation and beyond. J Exp Bot 62:3713–3725
- Murashige T, Skoog F (1962) A revised medium for rapid growth and bioassays with tobacco tissue culture. Physiol Plant 15:473–497
- Müller E, Brown PTH, Hartke S, Lörz H (1990) DNA variation in tissue-culture-derived rice plants. Theor Appl Genet 80:673–679
- Nagata T, Niyada E, Fujimoto N, Nagasaki Y, Noto K, Miyanoiri Y et al (2010) Solution structures of the trihelix DNA-binding domains of the wild-type and a phosphomimetic mutant of Arabidopsis GT-1: mechanism for an increase in DNA-binding affinity through phosphorylation. Proteins Struct Funct Bioinform 78:3033–3047
- Niederhuth CE, Schmitz RJ (2014) Covering your bases: inheritance of DNA methylation in plant genomes. Mol Plant 7:472–480

- Park Y, Wu H (2016) Differential methylation analysis for BS-seq data under general experimental design. Bioinformatics 32:1446–1453
- Park JS, Park JH, Park YD (2019) Construction of pseudomolecule sequences of *Brassica rapa* ssp. *pekinensis* inbred line CT001 and analysis of spontaneous mutations derived via sexual propagation. PloS One 14(9):e0222283
- Quadrana L, Almeida J, Asis R, Duffy T, Dominguez PG, Bermudez L et al (2014) Natural occurring epialleles determine vitamin E accumulation in tomato fruits. Nat Commun 5:3027
- Schmitz RJ, He Y, Valdés-López O, Khan SM, Joshi T, Urich MA et al (2013) Epigenome-wide inheritance of cytosine methylation variants in a recombinant inbred population. Genome Res 23:1663–1674
- Seymour DK, Becker C (2017) The causes and consequences of DNA methylome variation in plants. Curr Opin Plant Biol 36:56–63
- Shen Y, Zhang J, Liu Y, Liu S, Liu Z, Duan Z et al (2018) DNA methylation footprints during soybean domestication and improvement. Genome Biol 19:1–14
- Smulders MJM, De Klerk GJ (2011) Epigenetics in plant tissue culture. Plant Growth Regul 63:137–146
- Soppe WJJ, Jacobsen SE, Alonso-Blanco C, Jackson JP, Kakutani T, Koornneef M et al (2000) The late flowering phenotype of *fwa* mutants is caused by gain-of-function epigenetic alleles of a homeodomain gene. Mol Cell 6:791–802
- Stroud H, Greenberg MV, Feng S, Bernatavichute YV, Jacobsen SE (2013a) Comprehensive analysis of silencing mutants reveals complex regulation of the *Arabidopsis* methylome. Cell 152:352–364
- Stroud H, Ding B, Simon SA, Feng S, Bellizzi M, Pellegrini M et al. (2013b) Plants regenerated from tissue culture contain stable epigenome changes in rice. eLife 2:e00354
- Stelpflug SC, Eichten SR, Hermanson PJ, Springer NM, Kaeppler SM (2014) Consistent and heritable alterations of DNA methylation are induced by tissue culture in maize. Genetics 198:209–218
- Sun J, Jiang H, Xu Y, Li H, Wu X, Xie Q, Li C (2007) The CCCHtype zinc finger proteins AtSZF1 and AtSZF2 regulate salt stress responses in Arabidopsis. Plant Cell Physiol 48:1148–1158

- Taiko KT, Saze H, Kakutani T (2015) DNA methylation within transcribed regions. Plant Physiol 168:1219–1225
- Teixeira FK, Colot V (2009) Gene body DNA methylation in plants: a means to an end or an end to a means? EMBO J 28:997–998
- Uthup TK, Ravindran M, Bini K, Thakurdas S (2011) Divergent DNA methylation patterns associated with abiotic stress in *Hevea brasiliensis*. Mol Plant 4:996–1013
- Vaattovaara A, Brandt B, Rajaraman S, Safronov O, Veidenberg A, Luklová M, Wrzaczek M (2019) Mechanistic insights into the evolution of DUF26-containing proteins in land plants. Commun Biol 2:1–18
- Weeda S, Zhang N, Zhao X, Ndip G, Guo Y, Buck GA, Ren S (2014) Arabidopsis transcriptome analysis reveals key roles of melatonin in plant defense systems. PLoS ONE 9:e93462
- Xie Z, Johansen LK, Gustafson AM, Kasschau KD, Lellis AD, Zilberman D, Jacobsen SE, Carrington JC (2004) Genetic and functional diversification of small RNA pathways in plants. PLoS Biol 2:e104
- Xing MQ, Zhang YJ, Zhou SR, Hu WY, Wu XT, Ye YJ et al (2015) Global analysis reveals the crucial roles of DNA methylation during rice seed development. Plant Physiol 168:1417–1432
- Yang X, Han H, Carvalho DDD, Lay FD, Jones P, Liang G (2014) Gene body methylation can alter gene expression and is a therapeutic target in cancer. Cancer Cell 26:577–590
- Zhang H, Lang Z, Zhu JK (2018) Dynamics and Function of DNA Methylation in Plants. Nat Rev Mol Cell Biol 19:489–506
- Zilberman D, Henikoff S (2007) Genome-wide analysis of DNA methylation patterns. Development 134:3959–3965

Publisher's Note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.