REVIEW

Tissue culture-induced DNA methylation in crop plants: a review

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Abstract

Plant tissue culture techniques have been extensively employed in commercial micropropagation to provide year-round production. Tissue culture regenerants are not always genotypically and phenotypically similar. Due to the changes in the tissue culture microenvironment, plant cells are exposed to additional stress which induces genetic and epigenetic instabilities in the regenerants. These changes lead to tissue culture-induced variations (TCIV) which are also known as somaclonal variations to categorically specify the inducing environment. TCIV includes molecular and phenotypic changes persuaded in the in vitro culture due to continuous sub-culturing and tissue culture-derived stress. Epigenetic variations such as altered DNA methylation pattern are induced due to the above-mentioned factors. Reportedly, alteration in DNA methylation pattern is much more frequent in the plant genome during the tissue culture process. DNA methylation plays an important role in gene expression and regulation of plant development. Variants originated in tissue culture process due to heritable methylation changes, can contribute to intra-species phenotypic variation. Several molecular techniques are available to detect DNA methylation at diferent stages of in vitro culture. Here, we review the aspects of TCIV with respect to DNA methylation and its efect on crop improvement programs. It is anticipated that a precise and comprehensive knowledge of molecular basis of in vitro-derived DNA methylation will help to design strategies to overcome the bottlenecks of micropropagation system and maintain the clonal fdelity of the regenerants.

Keywords Crop improvement · Cytosine methylation · Plant tissue culture · RNA-directed DNA methylation · Tissue culture-induced variation

Introduction

The advent of plant tissue culture techniques becomes one of the most important tools in modern plant science research, and adoption of these techniques in crop production may provide the answer for adequate food manufacturing for the community. These techniques are not only used in the crop breeding programs but also have commercial importance, including micropropagation at a large-scale, recombination DNA technology, germplasm conservation, and natural plant metabolite production [[1](#page-13-0)]. Micropropagation techniques have great potential for crop improvement as it allows the production of pathogen-free genetically and physiologically

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similar plants in large numbers [[2\]](#page-13-1). Although tissue culture regenerants are planned to be alike; this is not always the case.

Due to fuctuations in the in vitro microenvironment, plant cells go through additional stresses, which induce genetic and epigenetic variabilities in the regenerants leading to tissue culture-induced variations (TCIV). Somaclonal variation is a widely accepted term representing TCIV, it was first proposed in plants by Larkin, Scowcroft [\[3](#page-13-2)]. Somaclonal variation occurs universally in all cell and tissue cultures indiferently of the micropropagation system [[3](#page-13-2)]. The occurrence of TCIV variation in the micropropagation system, is the reason behind the clones that are not true-totype to donor plants. This type of variations causes serious problems for the researchers and plant propagators who require fdelity in their clones. Despite of that, variability associated with the in vitro system provides a pool of natural variants upon which selection pressure can be appointed to isolate the desirable regenerants in the form of clones [\[4\]](#page-13-3). TCIV can be demonstrated as mitotically or meiotically

stable phenomenon [[5\]](#page-14-0), which may occasionally lead to the production of plant variants, useful in crop improvement programs [\[6,](#page-14-1) [7](#page-14-2)]. Mitotically stable variants create phenotypes which are physiologically diferent only among the primary regenerants and rarely transmitted to subsequent generations. This technique has been successfully used in case of ornamental plants and tree species where primary regenerants are the end products [\[8](#page-14-3)]. However, in a plant's lifecycle environmental and genetic changes induce DNA methylation, which could eventually create epigenetic variations and afect up to several generations [[9](#page-14-4)]. Occationally, epigenetic variations induce heritable changes in gene expression without altering the DNA sequences [\[10](#page-14-5)].

DNA methylation involves methylation in the DNA at the cytosine residues [\[11](#page-14-6)]. DNA methylation is allied with various molecular mechanisms such as regulation of genes, chromatin inactivation, genomic imprinting, and cell differentiation in plants [[12](#page-14-7)]. Available evidence shows that altered cytosine methylation pattern is much more frequent in the plant genome in the in vitro system and leads to discrete phenotypic changes [[10,](#page-14-5) [13](#page-14-8)]. Tissue cultureinduced mutations such as, activation of transposable elements, chromosome breakage, changes in DNA sequence are hypothesized to occur as a reason of DNA methylation, which eventually leads to high-rate occurrence of phenotypic variation [[8,](#page-14-3) [12\]](#page-14-7). DNA methylation is the most frequently found covalent base modifcation across the various taxa [\[14](#page-14-9)]. Specific DNA methylases generate several methylated bases during the state of post-replicative DNA modifcation, among which 5-methylcytosine (5-mC) is prevalent in higher plants and in mammals [[14](#page-14-9)].

Various methods are available to detect changes in the genome-wide methylation pattern in tissue culture plants. Most of these methods are based on comprehensive knowledge of an organism's genome sequence [[15\]](#page-14-10), such as bisulfte modifcation [\[16](#page-14-11), [17\]](#page-14-12) and chromatin immunoprecipitation (ChIP) [[18,](#page-14-13) [19\]](#page-14-14). Methylation-sensitive amplifcation polymorphism (MSAP) is a modifed amplifed fragment length polymorphism (AFLP) technique [[20\]](#page-14-15) that does not require genome sequencing. High-performance separation techniques such as high-performance capillary electrophoresis (HPCE) [[21](#page-14-16)] and high-performance liquid chromatography (HPLC) [\[22](#page-14-17)] are similarly used in detection of cytosine methylation. The review uncovers the studies showing alteration of DNA methylation patterns that are linked with the variation in the characters at single gene or genome level, by which a large number of high quality breeding material or improved agronomic traits can be attainable [[23\]](#page-14-18). On these grounds, cytosine methylation can be potentially used as an important source of variation for crop improvement. This review provides detailed information on various aspects of TCIV and its implications on a crop improvement program.

This review highlights the recent progress on this topic and flls in any existing gaps which have not been clarifed yet.

Plant tissue culture and micropropagation systems

A few possible pathways are available in plant tissue culture and regenerants can be obtained either by axillary bud proliferation, adventitious shoot regeneration or via formation of somatic embryos [\[24](#page-14-19)]. Organogenesis, i.e. formation of either shoot or root and somatic embryogenesis (SE)—the formation of a bipolar structure containing the root and shoot meristem at the same time from a somatic cell [\[24](#page-14-19)]. This technique is used for clonal propagation of various economically important plants [\[25](#page-14-20)], including grape [[26\]](#page-14-21), pineapple [\[27\]](#page-14-22), chili [[28\]](#page-14-23), strawberry [\[29](#page-14-24)], Siberian ginseng [[30](#page-14-25)], *Cymbidium* orchids [[31\]](#page-14-26), raspberry [\[32](#page-14-27)], and blueberry [[33](#page-14-28)]. Similar to organogenesis, somatic embryos can be obtained directly from the explants or indirectly with the interference of the callus formation at any stage of development [[25](#page-14-20)]. Although direct SE has been reported from microspores, ovules, embryos, and seedlings [\[26,](#page-14-21) [31](#page-14-26)], leaf explants are also found to be responsive to SE $[30, 33]$ $[30, 33]$ $[30, 33]$ $[30, 33]$ $[30, 33]$. However, there is a great variability on leaves´ response to SE induction across plant taxa.

In vitro‑induced variation: History and origin

The term TCIV or somaclonal variation has been widely used to denote the variations originated during the tissue culture process [[3](#page-13-2)]. Many other names are also used to describe this variation such as gametoclonal, protoclonal, and meridional variation, depending on their tissue of origin [\[34\]](#page-14-29). Ideally, clonal propagation process involves only mitotic division to produce plantlets asexually. Thus, all the regenerants should be phenotypically and genotypically identical [[35](#page-14-30)]. However, with the frst observation of TCIV [[36](#page-14-31)], it imposed a major problem in clonal propagation system [\[35\]](#page-14-30). The unmanageable occurrence of variations might be the reason for not including somaclonal variation regularly in crop improvement programs, as this could disturb the already present desirable traits in the crop plants. Despite that, several tissue culture-induced variants have been released as commercial varieties and cultivars [[37](#page-14-32)]. Unlike spontaneous mutations, TCIV arise frequently in explants and the occurrence of spontaneous mutations is much more frequent during in vitro culture than in in vivo culture [[38\]](#page-14-33). In tissue culture system, the genetic material is unprotected. Thus chances of exposure to chemicals present in the medium is higher due to which survival of the variants in non-inclusive environment increases with the rate of occurrence of mutation in tissue culture system than in field grown plants $[38]$ $[38]$. Even though, when the mutation rate is same in the somaclones and conventionally grown plants, detection of physiological variants is quite difficult in a crop grown in feld because of larger production area [\[38](#page-14-33)]. The variations in somaclones emerge due to spontaneously induced major uncontrolled changes in cells, tissues, or organs which may occur genetically or epigenetically [[34\]](#page-14-29) (Fig. [1](#page-2-0)). For instance, in twenty-fve regenerants from callus cultures of wild barley, no phenotypic diferences were identifed, although there were diferences in the their rDNA spacer length and SDS PAGE profle of hordein [\[39](#page-14-34)]. However, often somaclones are morphologically diferent from the donor plants and are permanently diferent when the variations are genetic and heritable [[8\]](#page-14-3). On the other hand, temporary changes occur due to the epigenetic or physiological factors which always do not inherit to the next generation [\[8](#page-14-3), [35\]](#page-14-30). Chromosomal aberrations, sequence variations, point mutations, transposable element activation, and most importantly alterations in DNA methylation patterns are examples of some genetic and epigenetic variations which contribute to somaclonal variation [\[4](#page-13-3)].

DNA methylation: A chromatin modifcation

In plants and mammals, DNA methylation is conserved and specifc patterns of genomic DNA methylation are extremely important for development [\[40\]](#page-14-35). It is well accepted that DNA retains information in a bigger context than the DNA sequence alone, while DNA sequences harbor genetic codes, and in some cases imprint these codes in a epigenetic fashion into various phenotypic traits [[14](#page-14-9)]. DNA methylation is an evolutionarily ancient covalent modifcation (cytosine converts to 5-mC), often associated with gene silencing in eukaryotes [\[41](#page-14-36)]. Among all the heritable and major epigenetic changes DNA methylation is one of the best studied process [[23](#page-14-18)]. DNA methylation level varies from 0 to 3% in insects, 2–7% in vertebrates, up to 10% in fish and amphibians, while plant genome shows a high rate of DNA cytosine methylation of over 30% [[16,](#page-14-11) [41](#page-14-36)]. In plants, DNA methylation usually occurs in CpG islands in all symmetric (CG or CHG, where $H = A$, T or G), and asymmetric (CHH) contexts unlike animal where CG methylation prevails [\[23](#page-14-18)]. Among these, three types of cytosine methylation occurs in plants, frequency of CG sequences getting methylated is highest followed by CHG and CHH sequences [\[23\]](#page-14-18). For instance, in Arabidopsis genome-wide cytosine methylation 24% was reported from CG context, while 6.7 and 1.7% were from CHG and CHH contexts [\[16](#page-14-11)]. Another study on whole genome bisulphite sequencing (WGBS) on mulberry under drought stress tolerance deciphered that methylated cytosines were most prevalent in CG sites (44.28%) followed by CHG (28.50%) and CHH (27.22%) sites [[17\]](#page-14-12).

To ensure if DNA methylation is inherited correctly to the next generation, several molecular mechanisms are involved [\[14\]](#page-14-9), and many of these mechanisms have been studied in detail in Arabidopsis [\[41](#page-14-36)]. In Arabidopsis mutations in the fragment of methylation and demethylation pathways are not always lethal, yet it appears to be crucial during development and environmental stress responses in plants with complex genomes [[40\]](#page-14-35). It was long established that in plants DNA methylation is not an active process rather disturbed stability of DNA methyltransferases may cause decreased level of DNA methylation [\[42](#page-14-37)]. In plants,

domains rearranged methyltransferase 2 (DRM2) catalyses the *de novo* DNA methylation [\[40](#page-14-35)]. DRM2 is a homologue of DNA methyltransferase 3 [\[40\]](#page-14-35), which is a family of *de novo* methyltransferases in mammals [[41](#page-14-36)]. Unlike mammals, for *de novo* methylation in plants an RNA-directed DNA methylation (RdDM) pathway is of high importance [[40](#page-14-35)]. In the canonical RdDM pathway as studied in Arabidopsis [\[43\]](#page-15-0), RNA polymerase IV (POL IV) synthesizes short single stranded RNAs then RNA-dependent RNA polymerase 2 convert them to double stranded RNAs (dsRNAs) [\[40,](#page-14-35) [44](#page-15-1)]. Dicer-like protein 3 (DCL3) cleaves the dsRNAs into small interfering RNAs (siRNAs) and incorporated onto Argonaute (AGO) proteins, especially AGO4 and AGO6 [[44](#page-15-1)]. The second stage of canonical RdDM pathway is established on RNA polymerase V dependent transcription of non-coding RNAs (ncRNAs) [[44\]](#page-15-1). The ncRNAs are connected through the sequence complementarity of AGO4 and AGO6 proteins loaded with siRNAs [[40](#page-14-35)]. Right after the AGO, siRNA, ncRNA and POL V ribonucleoprotein complex is assembled, DRM2 comes into play to target DNA methylation [[40\]](#page-14-35). Canonical RdDM pathway is moderated by POL IV-dependent 24-nt siRNAs, small RNAs from various origins such as polymerase II (POL II) transcripts and viruses and moderate non-canonical RdDM pathways [[45\]](#page-15-2). Initially, the species of RNA triggering RdDM was unknown, later studies found out involvement of siRNAs and long noncoding RNAs (lncRNAs) in this mechanism [\[14](#page-14-9), [40](#page-14-35)]. In the centromeric region, and repetitive sequences of the Arabidopsis genome DNA methylation is heavily abundant [\[46](#page-15-3)], of which one-third of the methylated loci are highly associated with siRNAs which also points to the fact that siRNAs are involved in DNA methylation [[47](#page-15-4)]. siR-NAs are commonly associated with transcriptional silencing and targets CG or CHH cites for methylation and with each cycle of DNA replication, siRNAs preserves the pattern of CHH methylation in the daughter cells [[43\]](#page-15-0). RdDM pathway directs DRM2, DNA methyltransferase 1 (MET1) and chromomethylase 3 (CMT3) to their target sites, as CHH methylation cannot be maintained by methyltransferases [[43\]](#page-15-0). siRNAs play a key role in fne tuning any undesirable methylation pattern via RdDM pathway [\[14](#page-14-9)] and furthermore deep sequencing of siRNAs at various stages of plant development will reveal other key roles characterized by them. RdDM is involved in various biological processes such as, paramutation, repression of transposons activity, biotic and abiotic stress responses, and creation of methylation patterns during reproduction [\[40\]](#page-14-35). This pathway was frst discovered in transgenic tobacco plants infected with viroid, non-protein-coding RNA molecules of few base pairs long which produced recombinant viroid sequences in the plant genome after replication mechanism [\[48](#page-15-5)]. Although there are some pathways involved in silencing untargeted sequences, DNA methylation maintenance pathways alter the action of epigenome $[14]$ $[14]$. To sustain the silenced state of transposons and to conserve the cell identity, stability of established global DNA methylation pattern is crucial [\[41](#page-14-36)]. Maintenance of DNA methylation in plants depends on the susceptibility of the methyltransferases towards diferent context of cytosine sequences such as CG, CHG and CHH [[40\]](#page-14-35). CG methylation is maintained by DNA methyltransferase 1 (MET1 or DMT1), which is plant homologue of DNA methyltransferase 1 [[41\]](#page-14-36). MET1 identifies the hemimethylated CG context after DNA replication and converts the unmethylated cytosine to 5-mC in the daughter strand [[49\]](#page-15-6). CHG methylation is maintained by CMT3 in a greater extent than by chromomethylase 2 (CMT2) [[16](#page-14-11), [41\]](#page-14-36). Methylated CHH context is maintained by DRM2 or CMT2 based on genomic region [\[40](#page-14-35), [44](#page-15-1)], for instance DRM2 preserves the RdDM target sites while CMT2 catalyses heterochromatin containing histone H1 which is prohibited from RdDM [[40\]](#page-14-35). It was also found that in case of DDM1 (decrease in DNA methylation 1) mediated RdDM pathways CMT2 catalyze CHH methylation [[40](#page-14-35)]. Although the maintenance of methylation status by these pathways is well studied, the removal of DNA methylation by the same is not outlined accurately [[41](#page-14-36)]. DNA methylation in angiosperms is well maintained by the plant genome itself, new information on establishment and maintenance of this has extended our knowledge on regulation of DNA methylation [[14](#page-14-9)]. It is still very important to have a clear understanding of these molecular mechanisms to use them for improvising the epigenome for crop improvement programs.

DNA methylation and gene expression

The molecular mechanism behind transcriptional control during plant development is not yet completely understood. Studies have shown that in plants, DNA methylation suppresses DNA-transcription factor associations, which in turn regulates gene expression and various cellular processes [[41\]](#page-14-36). Recent studies on whole genome methylation regarding gene expression have emphasised the efect of DNA methylation on gene regulation. Methylation commits to the inactivation of transposable elements or foreign DNA, thus maintains the stability of whole genome over non-homologous recombination and controls gene transcriptions [\[9](#page-14-4)]. DNA methylation also afects the developmental characters in plants. For example, linaria demonstrated variation in foral symmetry due to cytosine methylation [\[50](#page-15-7)]. The changes in foral symmetry resulted from epimutation and no changes were detected in the DNA sequence. However, these epigenetic changes were unstable and reverted to the original form after a certain number of generations. linaria epimutants produce radially symmetrical fowers instead of producing bilaterally symmetrical fowers. Due to the loss of function of linaria cycloidea-like gene (*Lcyc*), mutant fowers were produced in the same plant. It was found that in the mutant plants *Lcyc* gene persists in a highly methylated state, which causes the suppression of *Lcyc* gene function [[50](#page-15-7)]. Although epigenetic variations are mostly non-heritable [[4,](#page-13-3) [51](#page-15-8)], genes which are silenced by DNA methylation can be relocated to the alleles on sister chromatid or homologous genes on the other chromosomes. The process by which gene gets suppressed by DNA methylation and transfer of that to the sister chromatid is referred as paramutation [[52\]](#page-15-9). Paramutation is unpredictable in nature and may lead to the production of variant phenotypes. In maize, paramutation has been well described in four genes, such as *b1*, *r1*, *p11*, and *p1* which are responsible for encoding the transcription factors and biosynthesizing favonoid pigments [[53\]](#page-15-10). Among these four genes paramutation at *b1* is extremely stable of all systems, because of which it is widely used as a model to study paramutation [\[54](#page-15-11)]. Paramutants are generated due to methylated *B1* locus transferred to a non-methylated allele on the complementary gene, resulting in repression of gene expression [\[55\]](#page-15-12). DNA methylation can generate novel epiallelic state after transcription process which can provide a new avenue to give rise to phenotypic variation when it is lacking genetic mutation.

Transgenerational epigenetic memory and DNA methylation patterns

An organism's epigenetic information may afect their phenotype, which can be feasibly stored and inherited following segregation as cytosine methylation [[5\]](#page-14-0). DNA methylation may activate a gene which has been silenced by other mechanisms during embryo development. On the contrary, embryonic transcription may result in complete exclusion of DNA methylation machinery [[11\]](#page-14-6). Heritability of methylation state is a spontaneous phenomena which supports the concept that DNA methylation could be included or excluded for specific cellular memory during development [[11\]](#page-14-6). However, a growing number of evidences are available on heritable natural diference in the DNA methylation patterns of two individuals of the same species and it has a comprehensive capacity to confer to quantitative trait variation and crop improvement [[5\]](#page-14-0). Evidences of epigenetic variations having an infuence on natural variations can be seen in few classic examples, such as *peloric* mutant of linaria [\[50](#page-15-7)], a *colorless non-ripening* variant of tomato [[56\]](#page-15-13), and sex determination of melon [[57\]](#page-15-14). These are the few cases where meiotically heritable epialleles give rise to morphological variations. Epigenetic alleles or epialleles are referred to the methylation level of certain region of genome which varies between individuals [\[40\]](#page-14-35). Within genetically diversifed Arabidopsis population epiallelic variation has been discovered, however, it is still not clear if epialleles were emerged due to genetic variations [[58](#page-15-15)]. It has been also found that RdDM pathways can afect protein-coding genes by silencing their activity and giving rise to epialleles which could be heritable by mitosis/meiosis [\[14\]](#page-14-9). Epialleles can possibly be generated during DNA methylation maintenance or mutagenesis, which in turn creates an avenue for crop improvement by using artifcially generated epialleles.

DNA methylation as molecular basis of TCIV

Recent researches have been focused on detecting the frequency of epigenetic variations in the tissue culture system to assess the stability of clonally propagated plants [[51](#page-15-8)]. Epigenetic variations were reported to be stable for more than a hundred years but occasionally they revert back to the original form [[50\]](#page-15-7). During callus formation, cultures are successfully being established as experimental model systems [[59\]](#page-15-16) to unveil the dynamics of epigenetic changes during cell dediferentiation [\[51\]](#page-15-8), and eventually the regulation of developmental reprogramming [\[59\]](#page-15-16). Few well recognized examples of heritable and stable epigenetic modifcations were already discussed, such as frst natural plant variant linaria [\[50](#page-15-7)] and melon [[57](#page-15-14)]. It has been speculated that the environment has an intense role in epigenetic variations [[25\]](#page-14-20). For example, in Arabidopsis heat tolerance might get afected by CMT2-dependent CHH methylation, where it has been also showed that an allele at CMT2 locus exhibits a modifed whole-genome CHH methylation pattern associated with temperature resilience [[60](#page-15-17)]. It has been found that the *Cmt2* mutants displayed higher level of heat tolerance, which in turn suggests genetic regulation of epigenetic mechanisms leading to natural adaptation to various levels of heat-stress [[60\]](#page-15-17). According to the epigenetic theories, the interaction between an organism's genes and environment afects an individual's developmental process and eventually it's heredity to the next generation [[5\]](#page-14-0). In contrast to genetic alterations, epigenetic modifcations may be heritable and can be infuenced by the environment [\[5\]](#page-14-0). In the tissue culture system, the occurrence of epigenetic variations has been reported at several stages [[10,](#page-14-5) [51](#page-15-8), [61](#page-15-18)]. It was hypothesized by Phillips et al. [[62](#page-15-19)] that DNA methylation could be the prime factor in TCIV. Several studies have reported TCIV in plants due to DNA methylation. For example, higher level of DNA methylation was noticed within maize callus and in vitro regenerated plants [\[10,](#page-14-5) [63\]](#page-15-20). Similarly, Brown et al. $[64]$ $[64]$ $[64]$, Müller et al. $[65]$, and Stroud et al. $[66]$ $[66]$ found that high frequency DNA methylation and sequence variation were present in the progeny of the tissue culture-derived rice plants. In lowbush and hybrid blueberries, higher level of methylated CCGG sites were found in callus (215–258), while in the leaves methylated tetranucleotides sites were present in comparatively low number (75–100) [[67](#page-15-24)]. However, analysis with methylation sensitive/insensitive

restriction enzymes proved that DNA methylation does not play as the main factor behind all these changes.

It was reported that DNA methylation may afect gene expression by altering the chromatin structure via creating variation in methylation at specifc sites which could result in alteration of gene expression sites in a positive or negative way [\[68\]](#page-15-25). Higher expression of *OsSPL14* (*Squamosa promoter binding protein like—14*) promoter during the reproductive stage in rice due to hypermethylation increase panicle branching leading to higher grain yield [\[69\]](#page-15-26). In this study the authors have shown incorporation of the *OsSPL14–WFP* (*Wealthy farmer's panicle*) allele in the commonly used rice variety 'Nipponbare' improved rice grain yield. This is an example of positive gene expression due to DNA methylation, on the other hand classic example of gene expression in a negative fashion due to DNA methylation is mantled in vitro-derived variants of oil palm [\[70\]](#page-15-27). Tissue culture-induced abnormality due to hypomethylation in oil palm fruit severely reduced the oil production and mainly afected the production of elite hybrids for oil production via micropropagation. However, there are various examples available on attaining superior agronomic quality due to DNA methylation, many other studies also suggested that crop species which avoid DNA methylation might be agronomically superior to the ones which are vulnerable to DNA methylation [[9\]](#page-14-4).

Stress induced in tissue culture system and DNA methylation

Even in the absence of an inducing stimulus, epigenetic mechanisms create an epigenetic memory during cell division to store the changes occurred in the surroundings [[5\]](#page-14-0). It is well known that plant cells maintain their developmental plasticity during diferentiation [[42\]](#page-14-37) and need to go through reprogramming to switch from diferentiation to toti-/pluripotency [[1](#page-13-0)]. Under tissue culture system, explants undergo either direct/indirect organogenesis or SE [[1](#page-13-0)]. In case of indirect organogenesis process, the cells go through dediferentiation, which incorporate chromatin level reprogramming to induce callus formation $[1, 63]$ $[1, 63]$ $[1, 63]$ $[1, 63]$. Eventually the proliferating cells in the callus go through rediferentiation with the application of plant growth regulators (PGRs) in the culture medium leading to organogenesis or plantlet regeneration [[51](#page-15-8)]. The dediferentiation and rediferentiation process under an artifcial condition during in vitro culture, imposes traumatic stress on the plant cells, which initiate mitotically and meiotically heritable genetic and epigenetic variations [[8\]](#page-14-3). Stresses which arise during plantlet regeneration via tissue culture process afect the normal functioning of cell organelles, but plasma membrane and cell wall sense the stress frst and produce reactive oxygen species (ROS) [\[71](#page-15-28)]. Overproduction of ROS by lipid autolytic peroxidation or antioxidative defences creates oxidative damages to the cells [\[72\]](#page-15-29). Cellular homeostasis is not conserved in tissue culture system under stress like cold and heavy metal and excess production of ROS may infuence the decadence of DNA, proteins, lipids and pigments afecting cellular functioning [[71\]](#page-15-28) leading to TCIV [\[42](#page-14-37)]. Cassells, Curry [\[72\]](#page-15-29) speculated that in plant tissue culture system various factors such as recalcitrance, hyperhydricity, poor physiological condition of explants are also involved behind inducing genetic and epigenetic variation, where oxidative-stress damage plays a major role [\[72\]](#page-15-29). Not only that but also TCIV can occur due to epigenetic regulation as it may results in permanent alteration of DNA methylation level [\[42\]](#page-14-37). Although there are many reports available on this area, transgenerational responses leading to TCIV due to environmental stress in maize is one of the classic instances [[8](#page-14-3)]. The sources of variations can be categorized according to the time of occurrence in the explants, such as pre-existing or variation induced during in vitro process [\[35](#page-14-30)]. Although pre-existing variations such as chimeras in the explants could eventually induce stress diferently and leads to variation [[35](#page-14-30)], clear understanding of which including methylation pattern is very important to comprehend the changes arise during tissue culture process.

Permanent variations in the regenerants are caused by the presence of pre-existing variations in the source plants or may be due to the expression of novel variations as an effect of an unknown mechanism(s) in the genome $[3]$ $[3]$. The genotype, explant type, propagation method, use of PGRs, ploidy level of explant tissue, and the age of culture are main determining factors of precedent variations in tissue culture system [[6](#page-14-1)]. TCIV have been studied extensively to date, yet this phenomenon is far from complete understanding. Pre-existing variations arise separately from the efect of mutations, epigenetic changes such as alteration in DNA methylation pattern or by the combined efect of genetic and epigenetic factors [\[8\]](#page-14-3). However, qualitatively and quantitatively inherited mutations, use of chimeric tissues as explants, sequence variations, chromosomal aberrations, regulation of cell cycle, and transposable element activation in explants are also reasons behind the presence of pre-existing variations in the explant tissues [[35\]](#page-14-30).

The frequency of appearance of somaclones and the nature of variation difer with the diferent explant sources used for clonal propagation [[73](#page-15-30)]. It has been noticed that in profoundly diferentiating tissues such as roots, leaves, and stems normally produce an increasing number of variations if used as explants rather than tissues with pre-existing meristem, for example shoot tips and axillary buds [[74](#page-15-31)]. Regeneration from older and/or highly specialized structures generally recover higher amounts of variation in the regenerants [[75\]](#page-15-32). Adventitious shoot regeneration directly from leaves, petioles, shoot internodes, segments of root, anthers, hypocotyls, cotyledons or indirectly through formation of callus from the same type of explants shows higher amounts of variations in the regenerants [[76\]](#page-15-33). The presence of chimeric tissue in the explants [[34](#page-14-29)], and the unstable behaviour of the explants in the tissue culture system due to in vitro-derived stresses are also involved in the induction of somaclonal variation [\[35\]](#page-14-30). Reportedly, type of explants as well as the age of the explants used in the tissue culture system are the major determinant factors of the plantlet regeneration rate [\[77](#page-15-34)]. In general lower rate of DNA methylation was observed in the cultures, when the explants were obtained from young plants of *Pinus radiata* D. Don [\[78](#page-15-35)]. In contradiction, higher proportion of methylated cytosines (22.4%) was noticed in the young microshoots tissues of *Acacia mangium* in comparison to the mature microshoots with lower methylation rate (20.7%) [\[79](#page-16-0)].

TCIV may also arise due to the presence of callus in the in vitro culture. Variants originating from the callus are sometimes denoted as "calliclones" and commercial laboratories try to avoid callus formation during micropropagation due to the occurrence of variation in in vitro-induced callus [[80\]](#page-16-1). Initiation of culture and subsequent subculture cycles make explants vulnerable to oxidative stress which might induce mutations [\[72](#page-15-29)]. In addition to that, it is evident that unorganized growth in diferent levels of tissue culture process from highly organized meristem tip culture to callus formation in the 'extreme' process like protoplast culture also impose stress and causes somaclonal variation [[34](#page-14-29)]. Generally, the extent of this stress depends on the technique of tissue culture [[75](#page-15-32)]. Consequently, it was also found in eggplant that indirect regeneration via callus phase shows a higher rate of mutation than plantlet production through axillary branching [\[81\]](#page-16-2). The extent of DNA methylation is also reported to be dependent on the level of diferentiation. It was observed that, DNA methylation level changes radically as calluses go through the dediferentiation and redifferentiation process [[82\]](#page-16-3).

In various plant species, callus formation starts with the application of exogenous auxin and cytokinin [[83](#page-16-4)]. Ideal concentration, and the ratio of auxin and cytokinin are most important for the efficient shoot, and root regeneration. Exogenously applied PGRs control primary events, which induce cell cycle disturbance leading to morphogenesis and the introduction of variations among the regenerants [\[83\]](#page-16-4). In genetically abnormal cells, PGRs increase the rate of cell division [[84](#page-16-5)] and also the presence of PGRs in the media might induce somaclonal variation via cell-cycle disturbance [[83\]](#page-16-4). Morao et al. [\[85](#page-16-6)] studied the comparison between DNA methylomes among various cell types where they found that mitotically active columella cells from root tips exhibits highest methylation level especially at CHH sites over transposons sequences implying strong RdDM activity. Comparative level of auxin and cytokinin infuence

the genetic composition of the cell population $[86]$. It has been observed that the application of 6-Benzylaminopurine in high concentration (15 mg/l), increases the chromosome number in the banana somaclone CIEN BTA-03 derived from a cultivar 'Williams' [[87](#page-16-8)]. Similarly, a higher concentration of artifcial auxin 2,4-Dichlorophenoxyacetic acid (2,4-D) also triggers somaclonal variations in soybean [[88\]](#page-16-9) and cotton [[89\]](#page-16-10). This is possibly due to the frequent use of 2,4-D in callus and cell cultures inducing genetic anomalies such as polyploidy and endo-reduplication of DNA [[90](#page-16-11)]. The effect of 2,4-D was also found in genome-wide cytosine methylation in carrots. The application of 2,4-D in the embryogenic culture of carrot promotes total cytosine methylation, therefore 2,4-D alters the pattern of methylation in the genome [[91\]](#page-16-12).

Induction of somaclonal variations during the in vitro condition also reportedly infuenced by the number and length of the subculture cycles. With the increased number of subculture cycles, higher proliferation rate can be obtained in a relatively short period of time in tissue culture [[92,](#page-16-13) [93](#page-16-14)]. In cell suspension and callus culture, the chances of somaclonal variation increases with a higher number of the subculture and duration in in vitro culture [\[92](#page-16-13)]. In micropropagated banana, somaclonal variation started to appear at 1.3% after the ffth subculture, and after 11th subculture increased to 3.8% [[93](#page-16-14)]. In addition to subculture cycle, the length of the culture period also affects the rate of somaclonal variation occurrence [[92\]](#page-16-13). Four months of in vitro storage was suggested as a solution to the unstable ploidy level observed in long-standing coffee cell culture [[94\]](#page-16-15). The same phenomenon was observed in olive, where diference in the morphological characters was confrmed by randomly amplifed length polymorphism (RAPD) analysis in long term cultures [\[95](#page-16-16)].

DNA methylation and organogenesis

During organogenesis, regulation of specifc genes is very important and DNA methylation is described as one of the regulatory mechanism during this process [[25](#page-14-20)]. Several reports are available on efects of DNA methylation in direct organogenesis. In bush lily for example, the rate of DNA methylation was higher in shoot tip regenerated plants than the plants from young leaves or petals [\[96](#page-16-17)]. However, along with the explants in vitro and ex vitro environmental factors also infuence DNA methylation during organogenesis processes [[61](#page-15-18)]. In apple shoot tips organogenesis, it was observed that DNA methylation was infuenced by the prolonged exposure of the tissue to low $(4 \degree C)$ temperature, though the DNA sequence or ploidy level did not change [\[97](#page-16-18)]. Effects of DNA methylation were also studied in indirect organogenesis along with direct organogenesis. In tissue culture-derived Arabidopsis callus, few chromatin modifying enzymes like *MET1*, *KRYPTONITE*, histone demethylase gene *JUMONJI 14*, and histone acetyltransferase *WUSCHEL* (*WUS*) were analyzed to identify their infuences on degree of shoot regeneration [[98](#page-16-19)]. Bisulfte sequencing (BS-seq) and ChIP results demonstrated that the methylation and histone modifcation at the promoter region of the gene resulted in altered expression of these genes and rate of shoot regeneration from the callus [[98\]](#page-16-19).

DNA methylation and SE

SE is one of the best studied plant tissue culture process [\[23\]](#page-14-18) and it is affected by many factors. DNA methylation is regarded as a very crucial factor to control the induction and developmental process somatic embryos similarly to the zygotic embryos [[99](#page-16-20)]. It is reported that DNA hyper and hypomethylation impact the SE process [[30](#page-14-25), [99,](#page-16-20) [100](#page-16-21)]. For example, using HPLC/MS/MS method association of DNA hypermethylation was detected with somatic embryo development in *Acca sellowiana* [\[101\]](#page-16-22). Likewise, in *Coffea canephora* increase in DNA methylation level found to be positively correlated with rate of SE [\[99\]](#page-16-20). Furthermore, DNA hypomethylation has been found to be related to somatic embryo development from asynchronous T87 cell culture of Arabidopsis [\[100\]](#page-16-21). Ji et al. [\[102](#page-16-23)] found that the level of genome-wide DNA methylation, most apparently for CHH context increases during globular-stage of somatic embryos collected from 6 weeks to 13 years of soybean continuous culture. It was also clearly shown that DNA hypomethylation was most abundant in the already silenced regions and it was coupled with the gene upregulation responsible for reinforcing RdDM pathway [[102](#page-16-23)]. On the contradiction, in Siberian ginseng lower level of DNA methylation was detected using MSAP technique in embryogenic callus in comparison to the non-embryogenic callus [\[30](#page-14-25)]. The changes in DNA methylation pattern of plant cells and tissues arise during in vitro culture due to the exposure to diferent factors such as basal medium, PGR used, stages of culture, biotic and abiotic stresses due to wounding of the explant, nutrients used in the growth medium, physical factors, photoperiod, etc. [\[1](#page-13-0), [23](#page-14-18)]. DNA methylation pattern found under these conditions regulate gene expression related to SE and plant regeneration processes [[23](#page-14-18)]. For instance, in carrot cell suspension cultures, 16% methylated cytosine with stable DNA methylation pattern was seen during SE upon applying exogenous auxin. However, the application of hypomethylating drugs such as 5–azacytidine (5-azaC) and ethionine, blocked SE [\[91](#page-16-12)]. A similar trend was observed in alfalfa, application of 5-azaC in the embryogenic line decreased the formation of somatic embryos extensively [\[103\]](#page-16-24). Fraga et al [\[101](#page-16-22)] reported lower level of methylation in *A. sellowiana* cell culture when 5-azaC was added to the medium, but higher level of embryo induction was noticed when 5-azaC and 2,4-D were added in the culture in combination. It is also reported that at the preliminary stages of somatic embryo development, embryos contain comparatively lower levels of DNA methylation in comparison to the older stages [[73\]](#page-15-30). Occasionally, SE is selected as a desirable pathway for regeneration [\[75](#page-15-32)] as direct embryogenesis provides genetically similar plants than shoot tip regeneration because at preliminary stage of SE DNA contains comparatively lower level of methylation [[73\]](#page-15-30).

Methods of detecting in vitro‑induced DNA methylation

In large-scale commercial micropropagation, detection of variants is a matter of challenge due to the presence of a huge number of clones in a large area. Therefore, detection and exclusion of negative agronomic traits at early stages is very important to reduce economic loss to the growers [[35\]](#page-14-30). At later stages of any crop improvement program, it is essential to evaluate the variants at diferent environmental conditions for the successful establishment of desirable traits over generations [[74\]](#page-15-31). Although various methods are available to detect somaclonal variation, this review discusses the methods used for detection of DNA methylations in vitro. Modifed AFLP techniques are mostly used to detect tissue culture-induced DNA methylation [[51\]](#page-15-8). The principal of MSAP technique is constructed on the susceptibility of the pair of isoschizomers *MspI* and *HpaII* instead of *MseI*, as 'frequent cutter' enzymes, and *EcoRI* as a 'rare cutter' enzyme same as that used in the original AFLP protocol [[15,](#page-14-10) [20](#page-14-15), [104](#page-16-25)]. *MspI* and *HpaII* restrict the 5-CCGG-3 recognition site based on methylation of external or internal cytosine. *MspI* cleaves methylated internal cytosine residues (CmCGG) but not the external (mCCGG) whereas *HpaII* cleaves the hemimethylated external cytosine but remains inactive for fully methylated sequences [[105\]](#page-16-26). Although this is an economically feasible, fast, and easy practicable process for non-model organisms, the selection of these restriction enzymes may results in inconsistent data interpretation, which may not agree with the previously acquired data [\[15](#page-14-10)]. This technique was first developed in dimorphic fungi [\[104](#page-16-25)] and later used to detect methylation in rice [[106](#page-16-27)], banana [\[105](#page-16-26)], apple [[107\]](#page-16-28), Siberian ginseng [\[30](#page-14-25)], pepper [\[108](#page-16-29)], hop [[7\]](#page-14-2), *Doritaneopsis* orchid [[12\]](#page-14-7), freesia [[109](#page-16-30)], and blueberry [[67,](#page-15-24) [110](#page-16-31)]. Quantifcation of global DNA methylation can be done by high-performance separation techniques such as HPCE, HPLC [[111\]](#page-16-32). These techniques involve genomic DNA digestion to nucleotide, nucleoside or nitrogenous bases through enzymatic hydrolysis, to isolate, and analyze 5-mC [\[51](#page-15-8), [111\]](#page-16-32). Although both of this capillary hydrolysis based approaches are quite time consuming, they are highly specifc and sensitive, which makes them useful for rapid

quantifcation of global DNA methylation even from poorly isolated or low quality samples [\[111](#page-16-32)]. In some ornamental crops, such as Cedrus (*Cedrus atlantica*, and *Cedrus libani*) HPLC has been used to detect DNA methylation in axillary bud culture [\[22\]](#page-14-17), whereas HPCE was used in in vitro shoot culture of pea to detect the global methylation pattern [\[21](#page-14-16)]. Unlike in other eukaryotic organisms, in case of plants, genome-wide application using ChIP methodology is usually scarce [\[18](#page-14-13)]. ChIP techniques such as, (ChIP)-chip and ChIP-seq detect DNA methylation by mapping the point of interaction between DNA and the protein of interest. The ChIP-chip technique identifes the sites of DNA-protein interaction in DNA while ChIP-seq detects cytosine methylation by combining immunoprecipitation with shotgun sequencing technique [[18\]](#page-14-13). However, the huge amount of data generated through the high-throughput sequence creates a great difficulty to identify the protein binding sites in case of ChIP-based techniques [[19](#page-14-14)]. ChIP-seq was used in Arabidopsis to detect DNA-transcription factor binding site during DNA methylation process [\[19\]](#page-14-14). Bisulfte modifcation is another efficient mechanism to identify methylated cytosine. During the process, genomic DNA treated with sodium bisulfte converts cytosine to uracil, while methylated cytosine does not change [\[16](#page-14-11)]. WGBS is believed to be the best procedure to detect DNA methylation in plant samples as this technique allows to detect single nucleotide resolution of 5-mC on a genome while other techniques fails to provide that [[16](#page-14-11), [112\]](#page-17-0). Currently this is the most updated and direct approach which allows to identify and detect the pattern of methylated cytosine within the whole genome [\[113](#page-17-1)]. However, this technique is still very costly for the plants with comparatively larger genome size than Arabidopsis or rice [\[113\]](#page-17-1). So far WGBS has been used to detect level of DNA cytosine methylation on various plant genomes, which further proved the fact that DNA methylation varies across plant species. This technique was used in the detection of DNA methylation in the whole genome of Arabidopsis. An unknown side of the Arabidopsis methylome was revealed in WGBS procedure following next generation sequencing [\[16](#page-14-11)]. Recently, this technique has been used to detect altered methylation level on long-term in vitro shoot culture and regenerants of apple [\[114](#page-17-2)] and plants regenerated from pineapple callus culture [[112\]](#page-17-0). Methods detecting DNA methylation in some crops and plant species are listed in Table [1](#page-9-0).

Tissue culture‑induced DNA methylation and it's implication on crop improvement

In any crop improvement program genetic variations are crucial factors. Conventional plant breeders develop new cultivars by combining genes of interest from well-established varieties or linked species by the process of sexual hybridization, thus developed new cultivars with better agronomic traits [\[4](#page-13-3)]. With an ever-increasing human population, the demand for sustainable food production came up as a challenge for conventional plant breeders. The aim of a crop improvement program is to select the improved varieties with heterosis and transgressive variations, including both genetic and epigenetic modifcations [[5\]](#page-14-0). Mutations caused by heritable epigenetic traits are known as epimutations and these epimutations are very difficult to detect without the intervention of whole genome structure analysis [[41](#page-14-36)]. Examples of epimutations found in various plants are listed in Table [2](#page-11-0). Several recent studies on Arabidopsis have shown that in a population of recombinant inbred lines (epiRILs) individual plants difer from each other on the basis of epigenetic information [[5\]](#page-14-0). One of this studies demonstrated that the epiRILs were generated by exposing the genome to a mutation responsible for removal of DNA methylation and segregating away the mutation thus creating an altered methylation pattern in the segregated genomic segments [[126\]](#page-17-3). Although there are only a few examples are available on using a genetic approach identical to epiRILs, it can be used as a technique to introduce variations in crop plants. Predominantly genetic mutations result in loss-of-function allele while epimutations often lead to gain-of-function alleles by the loss of epigenetic silencing [\[5](#page-14-0)]. Epialleles that originates from various genetic mutations such as transposon insertions are quite stable because of the continuous presence of reprogramming machinery of chromatin modifcation. On the other hand, naturally occurring epimutations are less stable due to the lack of assurance of reinstating epigenetic information [[14](#page-14-9)]. Instability of the epimutants in comparison the genetic mutants can be a potential drawback of using epimutation in a crop improvement program. During a breeding program for crop improvement, if the epigenetic state only displays partial heritability, it can be difficult to stabilize the epigenetic state within the population and generate epimutants [[5\]](#page-14-0). However, epimutations in clonally propagated plant species may allow scrutinizing epiallelic alterations in favour of novel allelic variations without depending upon DNA recombination [\[5](#page-14-0), [135](#page-17-4)]. This would be specifcally important in case of clonally propagated species [[135](#page-17-4)], with either germplasm bottlenecks or limited recombination in some genomic region [\[5](#page-14-0)]. Another drawback of using epimutations for crop improvement program would be activation of transposable elements [[136](#page-17-5)], which can lead to generation of production of deleterious alleles and higher rate of mutation resulting into diminished utility of the epimutants [[5\]](#page-14-0).

While some horticultural crop species are clonally propagated to maintain their trueness-to-type, in conventional crop improvement programs heritable genetic variations are important components, which often create stable inbred and hybrid varieties for further agricultural use [\[5](#page-14-0)].

terms of fruit yield and other horticultural characters

Table 1 (continued)

Plant species	Epimutations	Induced during tissue culture	Phenotypic variant	References
African violet (Saintpaulia spp. H.Wendl.)	Retrotransposon activation of VGs1	Yes	Flower colour change	$[125]$
Alfalfa (Medicago trunculata Gaertn.)	Activation of Medicago retroelement $1-1$ (MERE1-1)	Yes	Curled root hair formation	[115]
Arabidopsis (Arabidopsis thaliana L_{\cdot}	Silencing of Apetala 1 (AP1) gene	No	Heavily methylated AP1 gene	[126]
Arabidopsis	Silencing of SUPERMAN gene	No	Defective floral organ	[127]
Arabidopsis	Silencing of FWA gene due to DNA methylation in SINE	N ₀	Late flowering	$\left[55\right]$
Arabidopsis	Spreading of DNA methylation in BSN gene	No	Stunted growth	[128]
Arabidopsis	Loss of <i>MET1</i> function	Yes	Altered shoot regeneration	[98]
Arabidopsis	Loss of DNA methylation at 5' UTR of At5g43500	No	Phenotypic variant	[129]
Arabidopsis	Silencing of Folate transporter 1 gene due to DNA methylation	No	Reduced fertility	$[130]$
Maize (Zea mays L.)	Activation of Ac1	Yes	Cytogenetic variability	$[131]$
Maize	Activation of spm	Yes	Coloured spot in kernel	$[132]$
Maize	Paramutation at maize b1 locus	N ₀	Anthocyanin pigmentation	$\sqrt{54}$
Melon (Cucumis melo L.)	Spreading of DNA methylation in CmWIPI	N ₀	Promoted female flowering	$[57]$
Oil palm (Elaeis guineensis Jacq.)	Hypomethylation of LINE retrotrans- poson	Yes	Mantled phenotype	[70]
Potato (S. tuberosum L.)	Activation of <i>Tto1</i>	N ₀	Change in tuber skin colour	[123]
Rice (Oryza sativa L.)	Silencing of D1 gene due to DNA methylation	N ₀	Dwarf variety	[133]
Rice	Hypermethylation at OsSPL14 promoter	N ₀	Higher grain yield and panicle branching	[69]
Rice	Hypermethylation at OsFIEI pro- moter	No	Dwarf variety	[134]
Toadflax (Linaria vulgaris L.)	Silencing of <i>Lcyc</i> gene due to DNA methylation	No	Changed floral symmetry	[50]
Tomato (Solanum lycopersicum L.)	Silencing of CNP gene due to DNA methylation	No	Defective fruit ripening	[56]

Table 2 Epimutations due to DNA methylation in various plant species

Predominantly, plant breeders tend to select phenotypic variations over a specifc molecular change, which occurs within a specifc generation, e.g. non-heritable epigenetic variations [\[4,](#page-13-3) [5\]](#page-14-0). Stable genetic variations can arise due to the genetic changes, for example, gene duplication, and insertions of transposons in the genome [[6](#page-14-1)]. However, as somaclones have widened the variability in crops, they can be used to improve many plant characteristics such as grain yield and quality, plant height, fowering, resistance to biotic and abiotic stresses such as insects-pests, diseases, cold, drought, salinity, and soil pH [[6\]](#page-14-1). Several reports are available demonstrating desirable variations in somaclones that are already used in plant breeding programs regularly. For instance, Indian mustard which has high yielding capacity and shattering resistance [\[37](#page-14-32)], mint with increased oil and herb yield [\[137\]](#page-17-16), neurotoxin devoid Lathyrus [[138\]](#page-17-17), early blight disease resistant potato [\[139\]](#page-17-18), salinity and drought tolerant sugarcane [[140](#page-17-19)], red rot disease resistant sugarcane [[141\]](#page-17-20), and aluminium toxicity tolerant rice [[142](#page-17-21)].

DNA methylation is the only epigenetic factor for which conservation and stable inheritance pattern in the consecutive generations are well understood [\[41](#page-14-36)], e.g. that heritable TCIV in rice regenerants for subsequent generations were often due to DNA hypomethylation which also sometime effect the expression of nearby genes [\[66\]](#page-15-23). In another study on maize, it was found that diferentially methylated regions were developed due to tissue culture process and among these regions hypomethylation was prevalent in comparison to hypomethylation [[63](#page-15-20)]. TCIV due to DNA methylation was detected in Arabidopsis lineages, where variations were

successfully inherited and segregated within R1 progenies, which provided the opportunity to study variations induced during tissue culture system in plants [[143\]](#page-17-31). DNA methylation also plays an important role managing the developmental events and response features in the in vitro system for example, in Arabidopsis callus and suspension cultures regulation of undiferentiated state due to gene repression by DNA methylation in the promoter region of a particular single copy gene has been reported earlier [\[59\]](#page-15-16). In general, a typical crop improvement program takes 10–15 years to be fully completed and undergoes many stages from germplasm collection to crop production [\[75](#page-15-32)]. DNA methylation can be used in crop improvement programs in a controlled way to generate better agronomic traits without incorporating any foreign genes [\[25](#page-14-20)] (Fig. [2\)](#page-12-0). Although in few cases, this method may not provide a extremely stable variant which will pass the long term conventional breeding procedure [[5](#page-14-0)]. In Arabidopsis, diminished DNA methylation gives rise to plentiful morphological and phenotypic irregularities which includes reduced apical dominance, decreased plant size, leaf size and modifcation, lowered fertility, and irregular fowering time [[13](#page-14-8)]. This may be due to the plants after going through the meiotic events, reportedly having decreased ability to reinstate the previous DNA methylation pattern [[13\]](#page-14-8). Some clonally propagated strawberry cultivars were observed with hyper fowering and abnormal fruit setting. Hyper flowering was reported from 'stipular buds' at a particular position of leaf petiole. These buds showed high multiplication rate in vitro and an increasing number of fower production per inforescence in ex vitro condition.

Fig. 2 Potential implications of DNA methylation in the cycle of crop improvement via plant tissue culture

This habit was speculated to be due to the DNA methylation and not the infuence of any true mutation [[144](#page-17-32)]. In lowbush blueberry, it has been reported that micropropagated plants are higher in polyphenols and favonoids than the softwood cutting plants [\[145](#page-18-0)]. However, number of flower clusters, berries, fruit weight per plants diameter and height of individual fruits were signifcantly reduced in clonally propagated plants [\[145\]](#page-18-0). Although molecular assay of the tissue culture regenerants with simple sequence repeat (SSR) markers established their genetic fdelity with the softwood cutting counterparts, it was hypothesized that variations originating in the blueberry clones probably due to epigenetic variations induced during the in vitro culture process [[145\]](#page-18-0). Later methylation analysis in micropropagated lowbush blueberry callus and leaves collected from the greenhouse grown plants confrmed that, in vitro derived calluses contained higher amounts (14–30%) of methylated cytosine in the genome, while the percentage of DNA methylation in leaves is comparatively lower (13–18%) [\[67](#page-15-24)]. Complete understanding of the molecular nature of TCIV is very important to exploit it further in crop breeding programs.

Future prospects

For many years, researchers have been discussing various possible ways to include epigenetic variations in crop breeding programs. Although there are not many reports available on using epimutations in crop improvements program, Thieme et al. [[146](#page-18-1)] discussed inhibition of RNA POL II to decrease DNA methylation at heat responsive *copia*-like retrotransposon *ONSEN* to introduce novel genetic variation. However, there are some well-known cases on undesirable epimutations such as *colourless non-ripening* (CNP) variant of tomato [\[56](#page-15-13)], reduction in palm oil yields due to DNA hypomethylation in *Karma* retrotransposon [[70](#page-15-27)]. Adaptation of tissue culture-induced (somaclonal) variation in crop improvement program have their advantages, for example, selection of somaclones in vitro may reduce the selection time and may fght biotic and abiotic stresses. TCIV has been successfully employed in many crop species with narrow genetic base and systems with limited genetic variations such as apomicts and vegetative reproducers [\[75](#page-15-32)]. Additionally, in the case of direct SE without any intervention of callus stage, embryos are formed from the individual somatic cell. Thus the chance of cellular mosaic formation is lower and originated plantlets are genetically similar with little variation [\[147](#page-18-2)]. For example, in clonally propagated 'Grand Naine' banana plants, SE has been used to reduce the chance of somaclonal variation [[148](#page-18-3)]. As somatic embryos arise from single somatic cells, the chances of induction variation decrease. Later it has been confrmed that in banana variety, production of variants was lower (1.6–7.9%) when plantlets were produced via SE than from shoot tip culture $(2.3-10.4\%)$ [\[149](#page-18-4)]. In general, clones originating from axillary branching are reported to be true-to-type to the donor plants [[2\]](#page-13-1). However, disadvantages of this process include chances of negative agronomic traits production, the occurrence of unpredictable changes, and the need for extensive feld trials of the somaclones before the release as a variety [\[4](#page-13-3)]. Moreover, the desirability of the somaclones is not possible to predict and there is no way to tell that the character of interest will always be modifed in an advantageous way [\[34](#page-14-29)]. Predominantly, somaclonal variations in the micropropagated plants are random and lack reproducibility. Therefore, the main concern about TCIV is to make it reproducible so that it can be used in regular crop breeding programs [[4,](#page-13-3) [35\]](#page-14-30). It is not very easy to control TCIV as more than one factor are responsible for the induction of variations in the tissue culture regenerants [[4\]](#page-13-3). These variations can be controlled by avoiding longer duration in in vitro condition and reducing the number of subculture cycles [[94](#page-16-15)]. In micropropagated banana, increased rate of variation was reported with the increasing number of sub-culturing [\[35](#page-14-30)]. Not only the culture duration and several subculture cycles infuence TCIV, mode of in vitro propagation method also afects the induction of variation. Reportedly, rice clones regenerated from protoplast culture gives rise to plant variants, which are diferent from conventionally propagated plants in terms of leaf morphology, fower characteristics, spikelet, and panicles [\[20](#page-14-15)]. Cellular organization of the explants is also a very important factor for somaclonal variation [[34\]](#page-14-29), generally the more breakdown of organizational structure (callus formation), the higher chances of occurrence of variation [\[35](#page-14-30)]. In clonally propagated 'Honeycrisp' apple, propagants shows some unexpected green and red colour patterns, which is found to be due DNA methylation at the promoter region of the *MYB10* transcription factor involved in anthocyanin production [[135\]](#page-17-4). Comprehensive knowledge of epialleles and epigenetic traits can help to crate a path of using DNA methylation profiling to identify the 'off-types' produced in tissue culture system [\[14](#page-14-9)]. Not only exclusion of deleterious alleles but also understanding epigenetic aspects of tissue culture regenerants will aid creating benefcial epialleles via epigenetic engineering.

Concluding remarks

Commercial micropropagation is based on trueness-to-type of the micropropagated plants to the donor plants. Various molecular approaches have been used to confrm the genetic fdelity in tissue culture plants. Although production of somaclones was thought to be originated from genetic variations, epigenetic factors are also found to be associated with phenotypic diversity. It is essential to understand the combining efects of genetic mutations and epigenetic variations on somaclonal variation to exploit it more efficiently in crop improvement programs. Even though somaclonal variation generates major problem regarding clonal fdelity in tissue cultured plants, it still provides a source for crop improvement in the plants with narrow genetic bases. Selection of the plants with desirable agronomic traits relies on induced variation during the tissue culture process. Recently, DNA methylation has been recognized as a major regulatory epigenetic mechanism which is associated with various regulatory gene functions during the tissue culture process. Although many studies are being performed on TCIV (including DNA methylation), the process is still far from being completely understood. Therefore, fully developed understanding of these processes will help to identify the hypervariable regions in the plant genome during tissue culture process, which could lead to the efficient control of somaclonal variations and their use in crop improvement programs on a regular basis.

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