## ACHIEVEMENTS AND PROSPECTS OF MOLECULAR BREEDING FOR DROUGHT TOLERANCE IN SOYBEAN [Glycine max (L.) MERR.]

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Khan M. A. (2018): Achievements and prospects of molecular breeding for drought tolerance in soybean [Glycine max (L.) merr.].- Genetika, Vol 50, No.3, 1095-1109.

Drought stress is one of the most serious constraints of soybean production worldwide. While the drought tolerance is one of the most complex attributes for soybean breeders to deal with. Due to complex (quantitative) nature of drought tolerance trait, the progress to develop drought tolerant plants is slow. Molecular breeding thus emerged as a necessary approach in soybean breeding programs. A plethora of genetic information regarding the functional genomics and other molecular resources is available. The effective and astute use of these resources will certainly facilitate the breeders to develop soybean cultivars tolerant to drought.

Keywords: Drought stress, Glycine max L., molecular breeding, soybean.

## INTRODUCTION

Cultivated soybean (*Glycine max* L.) is undoubtedly one of the most important legume crops providing a rich source of oil and protein to humans and livestock around the world. Its oil is also considered attractive as a future source of bio-diesel (HILL *et al.*, 2006; PIMENTEL and PATZEK 2008; CANDEIA *et al.*, 2009). With its ability to fix atmospheric nitrogen (BURRIS and ROBERTS, 1993), and hence requiring minimal nitrogen input in the form of fertilizers, makes it a profitable crop among the farmers. In 2017, the United States was the largest producer of soybean with 119.5 million metric tons (35%) production followed by Brazil and Argentina

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producing about 113 (33%) and 47 million metric tons (14%) respectively (SOYSTATS, 2018: <u>http://www.soystats.com</u>).

Soybean growth and productivity is severely affected by the myriads of abiotic stresses, among which the drought is the major one responsible for significant yield reductions. Almost every growth stage of soybean is sensitive to drought (MANAVALAN *et al.*, 2009). Conventional breeding methodologies for improving drought tolerance in crop plants are primarily based on screening germplasm and an empirical selection for yield under different drought stress conditions over several years (MANAVALAN *et al.*, 2009; TRAN and NGUYEN, 2009; HAMWIEH *et al.*, 2013). To deal with this, traditionally, breeders perform tedious crossings (hybridizations) and selections of superior progenies. The selected ones thus moved to field evaluations before given to farmers for general cultivation. Because of the variability in drought patterns from year to year, and to overcome the low response to direct selection, substantial efforts have targeted the manipulation of morpho-physiological traits influencing drought resistance through escape, avoidance, and/or tolerance mechanisms (LUDLOW and MUCHOW, 1990; BLUM, 1996; HAMWIEH *et al.*, 2013)

Over the past decades, rapid progress in DNA markers and their linkage maps has facilitated the identification, localization, and dissection of loci conferring quantitative traits (referred to as QTL) (PATERSON, 1995; HYTEN et al., 2010). The use of marker assisted selection (MAS) and transgenic techniques have far reaching applications in bringing rapid genetic improvements beyond the limits of conventional breeding. Thus molecular breeding is simply the integration of these modern tools in to conventional system of crop genetic improvement leading to development and release of advanced and productive cultivars. Numerous drought stress-related QTL/genes have been identified and a number of them have also been transferred to commercially grown cultivated varieties. The purpose of the present review is therefore to describe the key developments in the field of molecular breeding including mapping and genomics highlighting the need of integrated approaches for drought stress tolerance in soybean along with the future directions.

# ROLE OF QUANTITATIVE TRAIT LOCI (QTL) MAPPING AND MARKER ASSISTED SELECTION (MAS)

It is indeed ironic that most of the economically important breeding traits are complex. A complex trait is one that is controlled by a number of QTL/genes (in fact a QTL can carry multiple genes in itself). Drought tolerance is one such complex quantitative trait controlled by the minor (polygenes/QTL) with small but cumulative effect. Thus the identification of QTL is considered to be a great achievement in breeding. The stable and consistent expression of QTL across different environmental conditions is the most critical factor from breeding stand point. The application of DNA marker technology and QTL mapping has greatly facilitated our understanding of genetic basis underlying drought tolerance phenomenon (CUI *et al.*, 2008). The basic principle working behind is the tight linkage of DNA marker with the trait of interest so that even at the time of crossing over the two co-segregate together. A number of QTL associated with drought tolerance have been identified (Table 1). Mainly recombinant inbred lines (RILs), near-isogenic lines (NILs), backcross lines (BC), F2/F4 populations and doubled haploid lines (DH) are used as mapping populations to effectively map QTL.

DU et al., (2009) detected a total of 40 QTL related to yield and drought tolerance using RILs population developed from a cross between Kefeng1 (drought tolerant) and Nannong1138-

2 (drought sensitive). Leaf pubescence density (PD) is considered to be an important component for the adaptation of soybean to drought-prone environment, DU *et al.*, (2009) did QTL mapping using RIL population derived from cross between cultivars Kefeng 1 and Nannong1138-2. Simple sequence repeats (SSR) markers were utilized for that purpose. They detected a total of 20 QTLs on molecular linkage groups (MLGs) A2, D1b, E, H, G and I. The QTLs for PD on MLG H were mapped to near *Ps* locus while the QTLs on MLG D1b were located near *Rsc-7*. Three genome regions for PD and water status traits on MLGs A2, D1b and H were found to be associated indicating the important role of leaf surface PD trait in the soybean drought tolerance. WANG *et al.*, (2012) using backcross inbred line (BIL) population to map QTL for drought tolerance at germination stage. Using SSR markers, they identified 17 QTLs with additive effects and/or additive × environment interaction effects, involved in drought tolerance of soybean in germination stage, were found on linkage group G2-A2, G10-D2, G11-E.

Trait(s)	Cross	Mapping	Number	Type of	Reference
		population	of QTL	DNA	
			detected	marker	
Water use efficiency	S-100 x Tokyo, 116	F2	2	SSR*	MIAN et al., (1998)
(WUE)					
Yield, maturity, and water use efficiency	Minsoy x Noir 1	RILs	3	SSR	SPECHT <i>et al.</i> , (2001)
Leaf wilting	Jackson x KS4895	RILs*	1	SSR	BHATNAGAR <i>et al.</i> ,
Canopy wilting	KS4895 x Jackson	RILs	4	SSR	(2005) CHARLSON <i>et al.</i> , (2009)
Seed yield per plant	Kefeng 1 x	RILS	4 19(YP)	SSR	DU et al., (2009)
(YP) and drought	Nannong1138-2	KILS	19(11) 10(DSI)	331	DO el ul., (2009)
susceptibility index	Trainiong 1130-2		10(D31)		
Water relative content	Hongfeng 11 x Clark	BILs	8	SSR	CANDONG et al., (2011)
(WRC)	Hongleng II x Clark	DILS	0	bbit	
Germination and	Hongfeng11x Clark	BILs*	4	SSR	QIU et al., (2011)
seedling stages					
Canopy-wilting	PI 416937 x Benning	RILs	7	SSR	ABDEL-HALEEM et al.,
					(2012)
Shoot and root parameters	Essex x Forest	RILs	12	SSR	BRENSHA et al., (2012)
Germination stage	Hongfeng 11 x	BILs	18	SSR	ZHANG et al., (2012)
-	Harosoy				
Root architectural traits	Dunbar x PI	BILs	1	SNPs	MANAVALAN et al.,
	326582A				(2015)
Relative root and shoot	M8206 x TongShan	NAM*	111	SNPLDB	KHAN et al., (2018)
lengths	and ZengYang x				
	M8206				

Table 1 Summary of QTLs identified for drought tolerance in soybean<sup>a</sup>

\* RILs (Recombinant Inbred Lines), BILs, (Backcross Inbred Lines), SSR (Simple Sequence Repeats), SNP (Single nucleotide polymorphism), NAM (Nested association mapping).

<sup>a</sup> Similar studies reported in text have not been mentioned in this Table.

YANG *et al.*, (2014) also used BIL population of soybean derived from the cross of drought tolerant wild soybean, "SNWS0048" as a recipient parent and drought-sensitive variety "Jinda73" as a donor parent was examined to identify the QTL and epistatic QTL and GE effects on drought-tolerant physiological traits. They detected six QTLs with additive × effects and/or additive × environment interaction effects and three pairs of QTLs with additive × epistatic main and/or epistasis × environment interaction effects different water environment clearly indicating the affects of different water regimes on the expression of genes relevant to drought stress.

It can be inferred from the above discussion that a number of QTL/genes have been identified in soybean. However the procedure is not without some limitations too. For example,

i) The size of mapping population is critical. The larger the population size the better will be the mapping. However this is not always practical due to limited resources available.

ii) The phenotypic errors are sometimes large, as the accurate and precise phenotyping is the key to molecular mapping and can be affected by the non-availability of measurement techniques, and poor interpretation of field data etc.

iii) Moreover for the effective MAS deployment in to our breeding programs the precise stability of QTL across different genetic backgrounds is essential, however QTL x E and epistatic interactions unfortunately are the phenomena often misunderstood and due to this we are unable to achieve the anticipated benefits of MAS (XU and ZHU, 2012). Unstable QTLs give unreliable data when applied in MAS.

iv) A QTL will be of little importance if it fails to stabilize and improve the crop yield under stress (PRICE and COURTOIS, 1999).

#### ASSOCIATION MAPPING (AM) AND GENOME WIDE ASSOCIATION STUDIES (GWAS) IN SOYBEAN FOR DROUGHT TOLERANCE

The classical linkage mapping (QTL mapping) based on bi-parental crossing is effective in identifying large number of loci for drought tolerance. However identifying small effect QTL using the bi-parental population incurs a significant challenge for the breeders (HOLLAND, 2007). Moreover low heritabilities and high G x E interactions are some more significant demerits of biparental populations. In contrast to this the association mapping (AM) is another analytical approach for mapping QTL (NING *et al.*, 2016). AM (also called the linkage disequilibrium, LD mapping) refers to the significant association of marker with the phenotypic trait concerned (GUPTA *et al.*, 2005; SOTO-CERDA *et al.*, 2012). AM evaluates whether certain alleles are found within a population more frequently than expected (FLINT-GARCIA *et al.*, 2003). GWAS (based on LD) is a powerful approach to identify the genetic factors underlying the complex traits by telling the history of recombinant events occurred in any specific crop germplasm. GWAS typically use the high density single-nucleotide polymorphisms (SNPs) across the genome of a given species and determine the significant statistical marker trait associations (RAY *et al.*, 2015).

GWAS is fast becoming a standard tool for establishing marker trait associations. Regarding drought tolerance it has been performed in various crops like rice (WU *et al.*, 2015), wheat (EDAE *et al.*, 2014), maize (LIU *et al.*, 2013; XUE *et al.*, 2013; WANG *et al.*, 2016) and chick pea (THUDI *et al.*, 2014). Regarding soybean, DHANAPAL *et al.*, (2015) using GWAS identified 21 putative loci for carbon isotope ratio as a surrogate trait of water use efficiency (WUE). In

soybean, GWAS has also been performed for traits like plant height and maturity (SONAH *et al.*, 2015), yield and yield related components (HAO *et al.*, 2012; WEN *et al.*, 2015), protein and oil content (SONAH *et al.*, 2015; HWANG *et al.*, 2014), nitrogen related traits (DHANAPAL *et al.*, 2015; RAY *et al.*, 2015) and low-phosphorus stress (NING *et al.*, 2016).

The high rate of false positives due to spurious marker-trait associations is a main hurdle towards its wide range applicability. But because of the development of some powerful statistical tools, this issue has greatly been resolved (YU *et al.*, 2006). For instance, HE *et al.*, (2017) suggested an innovative restricted two-stage multi-locus GWAS procedure (RTM-GWAS) to resolve the encountered problems. In this method, tightly linked SNPs are grouped into SNP linkage disequilibrium blocks (SNPLDBs) to generate multiple haplotypes or alleles per block/locus to match the multiple-allele property of the natural population. Quite recently KHAN *et al.*, (2018) used this novel procedure and identified 73 and 38 QTLs with 174 and 88 alleles contributed main effect 40.43 and 26.11% to phenotypic variance (PV) and QTL–environment interaction (QEI) effect 24.64 and 10.35% to PV for relative root length and relative shoot length that served as drought tolerance indicators, respectively. However the best approach would therefore be to combine the two methods of QTL mapping (traditional linkage mapping and AM) to minimize each other's limitations with maximum accuracy and utilization of resources (MAHUKU *et al.* 2016). Keeping in view the wider applications of GWAS, it is expected that the use of this technique will substantially increase in the years to come.

#### TRANSGENIC APPROACHES

Transgenic technology has enabled the breeders to overcome the problem of direct gene transfers between entirely unrelated organisms. This approach carries two basic objectives; first to know the mechanisms involved in plant's innate response to stress factor and second to identify a transgene with a greatest possible impact on the stress itself and quickly being transferred from laboratory to the breeding programs designed to improve the cultivars (REYNOLDS et al., 2005). As the regulatory networks underlying the abiotic stress factors are fully explored, more and more so-called candidate genes can be identified to be used to develop transgenic plants (BARNABÁS et al., 2008; FLEURY et al., 2010). The subtle examples depicting the power of transgenes in soybean for drought tolerance is shown in Table 2. Naturally plant are bestowed upon with stress sensor signals able to perceive the external stress and thereby activating the transcription factors leading to the activation of cascade of genes making the plant to withstand that particular stress factor. Transcription factors (TF) is an important class of genes that up or down-regulate other genes especially at the time of stress. Most important and wellstudied class of transcription factors is drought responsive element binding (DREB) factors have been identified in regulating gene expression under drought, salt and cold stresses in Arabidopsis (YAMAGUCHI-SHINOZAKI and SHINOZAKI, 1994). GAO et al., (2005) observed improvement in wheat against drought and salt stresses by expression of stress inducible TF GmDREB from soybean. Similarly CHEN et al. (2007) isolated a novel DREB homologous gene, GmDREB2 from soybean and further found that the over-expression of GmDREB2 activated expression in transgenic Arabidopsis and tobacco, resulted in enhanced tolerance to drought and high-salt stresses.

GUTTIKONDA *et al.* (2014) introduced the *Arabidopsis thaliana DREB1D* TF driven by the constitutive and ABA-inducible promoters into soybean through *Agrobacterium tumefaciens*-mediated gene transfer. Transgenic plants showed differential drought tolerance responses with a

significantly higher survival rate compared to non-transgenic plants when subjected to comparable severe water-deficit conditions. A novel basic leucine zipper (bZIP) TF gene, GmbZIP1 was isolated from soybean cultivar Tiefeng 8 by GAO *et al.*, (2011). They found the expression of GmbZIP1 was highly induced by ABA, drought, high salt and low temperature in soybean roots, stems and leaves under different stress conditions. They also observed a greater tolerance to drought, salt and cold stresses due to GmbZIP1-overexpressing in transgenic Arabidopsis, tobacco and wheat plants. Similarly DE PAIVA ROLLA *et al.* (2014) transformed soybean with *AtDREB1A* for tolerance to drought. They also observed significant augmentation in yield components when the drought stress was introduced. Likewise, LI *et al.*, (2017) found over-expression of *GmFDL19*, also a bZIP TF in transgenic soybean leading to increased tolerance to salt and drought stresses.

Great progress has been made in developing transgenic lines over-expressing the transgenes. However mere over-expression has proven to be a futile attempt for durable and sustained tolerance. As a matter of fact, instead of using single gene, use of multiple genes is suggested for bigger and better impact (BAJAJ *et al.*, 1999) but is indeed a daunting undertaking. Nonetheless these transgenic plants can greatly help us in understanding and elucidating the responses of plant towards stress. But since the degree of drought significantly varies in field, the trangene expression may differ than what is observed in laboratory or green house conditions. Until recently FUGANTI-PAGLIARINI *et al.*, (2017) transformed soybean with DREB and ABA-responsive element binding (AREB) TFs and evaluated their performance in field conditions and quite encouraging results for drought tolerance were obtained. This further necessitates continuous and replicated field based evaluations over a range of environments and across different genetic backgrounds to clearly observe the effectiveness of this technology (NAKASHIMA *et al.*, 2014).

Gene	Encoded product	Donor	Transformation		
		organism	method		
P5CR	L- $\Delta^1$ -pyrroline-5-	Arabidopsis	Agrobacterium	The transgenic soybean	DE RONDE
	carboxylate		vacuum	plant were subjected to	et al.,
	reductase		infiltration	drought and heat stress.	(2004)
			transformation	The sense plant showed	
			procedure	mild symptoms of stress	
				while the antisense were	
				severely stressed	
GmMYB76,	MYB DNA-	Soybean	Agrobacterium-	The three GmMYB genes	LIAO et al.,
GmMYB92,	binding domain		mediated gene	played a differential role	(2008)
and			transformation	to stress tolerance in	
GmMYB177				transgenic Arabidopsis	
				plants	
GmUBC2	Ubiquitin-	Soybean	Agrobacterium-	Transgenic Arabidopsis	ZHOU et
	conjugating		mediated gene	plants over-expressing the	al., (2010)
	enzyme		transformation	gene showed enhanced	
				tolerance to drought and	

Table.2. List of transgenic lines developed in soybean for drought tolerance<sup>a</sup>

				san	
GmNAC11 and GmNAC20	Proteins localized to the nucleus and bound to the core DNA sequence CGT[G/A].	Soybean	Agrobacterium rhizogenes- mediated transformation	Over-expression of transcription factors promote abiotic stress tolerance and lateral root formation in transgenic tobacco and soybean plants	HAO et al. (2011)
AtMYB44	MYB DNA- binding domain	Arabidopsis	Agrobacterium tumefaciens	Expression of gene conferred drought/salt stress tolerance in transgenic soybean	SEO et al., (2012)
LOS5/ABA3	Molybdenum cofactor sulphurase	Arabidopsis	Agrobacterium- mediated gene transformation	Expression of LOS5/ABA3 was up- regulated by drought stress, which led to notable increase in ABA accumulation. Furthermore transgenic soybean under drought stress had reduced water loss by decreased stomatal aperture size and transpiration rate	LI et al., (2013)
AtAREB1	Leucine zipper (bZIP) protein that regulates abscisic acid (ABA)- dependent stress- responsive gene expression	Arabidopsis	Biolistic transformations	Transgenic soybean plants with improved water stress tolerance were observed.	BARBOSA et al., (2013)
GmPOI	Pollen_Ole_e_I conserved Domain	Soybean	Agrobacterium- mediated gene transformation	The soybean plants over- expressing <i>GmPOI</i> showed higher tolerance to drought stress than wild types	SONG et al., (2013)
GmEXP1	Expansin proteins	Soybean	Agrobacterium- mediated gene transformation	Transgenic tobacco plants over-expressing the gene showed enhanced	LO et al., (2015)

salt

				tolerance to drought.	
		Arabidopsis	Biolistic and	Results showed that the	MARINHO
AtAREB1	Leucine		Agrobacterium-	constitutive over-	et al.,
	zipper (bZIP)		mediated gene	expression of TF	(2015)
	protein that		transformations	AtAREB1 lead to an	
	regulates abscisic			improved capacity of the	
	acid (ABA)-			soybean crop to cope with	
	dependent stress-			drought with no yield	
	responsive gene expression			losses.	
BADH	Betaine aldehyde dehydrogenase catalyses the oxidation of betaine aldehyde	Atriplex canescens	Agrobacterium- mediated gene transformations	Transgenic soybeans expressing BADH showed increased drought tolerance	QIN et al., (2017)
-	to glycine betaine.				

<sup>a</sup> Similar studies reported in text have not been mentioned in this Table.

#### POTENTIAL OF FUNCTIONAL GENOMICS

Plant functional genomics is a rapidly evolving discipline concerned with knowing the function of genes. Since the drought tolerance is complex, so it is almost imperative to have in depth knowledge of hundreds and thousands of up or down regulated genes or proteins involved in the process. Expressed sequence tags (ESTs) are random sequences of gene transcripts, considered to be novel genomic tool for gene identification. The generation of ESTs from cDNA libraries and complete genome sequence information in Arabidopsis, rice and soybean provide valuable information about gene discovery (SREENIVASULU et al., 2007; SCHMUTZ et al., 2010). These ESTs are crucial for accurate genome annotation; provide valuable information about gene structure, expression patterns and transcript abundance (SEKI et al., 2002; UMEZAWA et al., 2008). Full-length cDNAs (obtained by reverse transcribing the mRNA) are regarded as robust tools functionally analyzing the genes and thus serve as a precious source for the improvement of soybean drought stress tolerance. UMEZAWA et al., (2008) obtained 6,570 new full-length sequences of soybean cDNAs derived from tissues treated with different abiotic stresses. With the advancement of DNA microarray technology, several hundred stress induced genes have been identified in plants and has indeed revolutionized the global gene expression profiling system (UMEZAWA et al., 2006; VIJ and TYAGI, 2007). Another method being used to elucidate the gene function is antisense- and RNA interference (RNAi)-mediated transcriptional gene silencing (as reviewed by MANAVALAN et al., 2009) and their involvement in drought tolerance in soybean was demonstrated by KULCHESKI et al., (2011). A relatively cost effective highthroughput gene sequencing technique known as RNA- sequencing (RNA-seq) is in use has several advances over microarray technology considering the fact that RNA-seq does not require gene information and is capable of identifying novel transcripts that were previously unknown and also providing opportunities to analyze non-coding RNAs (DESHMUKH et al., 2014). CHEN et al., (2016) used Illumina RNA-seq transcriptome profiling to study differentially expressed genes (DEGs) under drought and flooding conditions. A total of 2724 and 3498 DEGs were identified comprising of 289 TFs.

Similarly other functional genomics tools like serial analysis of gene expression (SAGE), array-based transcript profiling technologies and quantitative real time PCR (qRT-PCR) are in use to access the function of genes expressed in drought stress (SREENIVASULU *et al.*, 2007). Although we have not been able to realize the full potential of these tools, yet the availability of these functional genomics approaches coupled with the transgenic breeding opens a new exciting venture for soybean breeding leading us to a better understanding of the expression patterns of genes not only concerned with drought but also for other stresses too (TRAN and MOCHIDA, 2010).

### THE WAY AHEAD

Due to climatic changes, there will be increased occurrences of drought spells during the crop growth periods, and global food production will continue to be challenged. In that respect the demand for food is expected to rise with increasing world population; and therefore improving crop productivity to ensure yield on sustainable basis is imperative. Legumes are rich in proteins and thus have a unique role in alleviating the hunger and poverty from the world and thus leading to a sustainable agriculture. Soybean being one of the most important legumes is globally recognized as an important oil and food crop while drought being the most significant environmental stress hampering its production. Drought tolerance in a complex trait thus poses a significant challenge for the breeding programs destined to develop the soybean cultivars tolerant to drought. Conventional plant breeding has been and will likely to a potential key player keeping in view the climatic scenarios and addressing the food security issues around the globe. Dawn of molecular age has laid down the solid foundation for molecular breeding that has now emerged as a promising tool to overcome the barriers imposed by the conventional breeding. Identification of drought related putative QTLs coupled with MAS hold a tremendous potential to breed for drought tolerance in soybean. In addition to QTL mapping derived from biparental population, association mapping (LD) including GWAS further accelerates the dissection of complex traits by careful screening of large number of soybean accessions carrying the genetic variability. Genetic engineering is also an effective approach to deal with the current scenario. A number of candidate genes for drought tolerance have been incorporated from different crops to soybean. However more extensive work is still needed to judge the stability of these transgenic lines in field conditions. The completion of soybean genome sequence and beginning of functional genomics prove an invaluable source of elucidating and dissecting the gene regulatory networks allowing us to decipher the riddle of plant resistance towards drought. These approaches will certain to provide impetus to our breeding programs mostly thriving on conventional means, to combat the global issues related to climatic changes. We conclude by saying that for the better and comprehensive understanding of soybean crop response towards drought, an interactive and holistic approach integrating the breeding, genomics and molecular biology disciplines, is required to a much greater extent than currently being implemented for envisioning the long standing goal of getting good quality, high yielding drought tolerant soybean.

> Received, April 22<sup>tnd</sup>, 2018 Accepted November 18<sup>th</sup>, 2018

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## DOSTIGNUĆA I PERSPEKTIVE MOLEKULARNOG OPLEMENJIVANJA ZA TOLERANTNOST PREMA SUŠI KOD SOJE (*Glycine max* (L.) MERR.)

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#### Izvod

Stres stresa je jedno od najozbiljnijih ograničenja proizvodnje soje širom sveta, dok je tolerancija za sušu jedno od najsloženijih svojstava za oplemenjivače soje. Zbog kompleksne (kvantitativne) prirode osobine tolerancije za sušu, napredak u razvoju biljaka koji su tolerantni za sušu je spor. Molekularno oplemenjivanje stoga se pojavilo kao neophodan pristup u programima oplemenjivanja soje. Dostupan je veliki broj genetskih informacija u vezi sa funkcionalnom genomikom i drugim molekularnim resursima. Efikasna i upečatljiva upotreba ovih resursa svakako će olakšati oplemenjivačima da razvijaju sorte soje tolerantne na sušu.

Primljeno 22.IV.2018. Odobreno 18. XI 2018.