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# MOLECULAR BREEDING FOR ENHANCING RESILIENCE AGAINST BIOTIC AND ABIOTIC STRESS IN MAJOR CEREALS

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### SUMMARY

Molecular breeding includes marker-assisted selection, marker-assisted backcross breeding, along with other newer breeding approaches, such as marker-assisted recurrent selection and genomic selection. Marker-assisted selection is used to detect the presence or absence of genes in lines, cultivars, breeding populations and hence, accelerates the selection procedure in comparison to other conventional approaches. Researchers have identified and precisely mapped several genes through association with DNA markers. Genes linked to DNA markers include those governing resistance to biotic stresses and tolerance to abiotic stresses; for example in rice (Oryza sativa L.) for blast, bacterial blight, brown plant hopper, drought, submergence, salinity; in wheat (Triticum aestivum L.) for rusts, pre-harvest sprouting, and drought and heat tolerance; and in maize (Zea mays L.) for turcicum leaf blight, polysora rust, banded leaf sheath blight and drought tolerance. Incorporation of major genes or quantitative trait loci (QTL) into widely adapted cultivars has been achieved via marker-assisted backcross breeding. Marker-assisted pyramiding for 2 or more resistance genes provides opportunities for building resilience for serious diseases and insects. For complex traits such as drought, new strategies, such as marker-assisted recurrent selection and genomic selection are employed to increase precision and to reduce cost of phenotyping. Thus, molecular-breeding approaches offer ample opportunities for plant breeders to develop stress-resilient high-yielding cultivars. Furthermore, molecular and conventional breeding are not mutually exclusive; instead, they are complementary under most breeding schemes. This review highlights developments in molecular breeding relative to stress resilience in rice, wheat and maize.

Key words: Rice, wheat, maize, cold, molecular breeding, submergence, diseases, drought, heat, salinity

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### **INTRODUCTION**

Plant breeding can be defined as a science and technology that has evolved gradually during the past 10,000 years. It started with collection and selection of wild plants by primitive man and encompassed during 1700-1800 hybridization,

selection and evolution through natural selection. Subsequently, Mendelian and genetics, mutation, polyploidy quantitative (1900s), gene and molecular design-based science, i.e., gene cloning, direct gene transfer, markermarker-assisted selection (MAS), assisted backcrossing (MABC), omics and arrays, genomics-assisted breeding (2000s and beyond) became part of plant breeding. With the development of these modern molecular breeding tools, which will be discussed further in this review, plant breeding is becoming ever more precise, more efficient, easier and faster (Phillips ,2006). Traditional breeding approaches that rely on extensive phenotypic screening methods are effective but delay production of climate-resilient germplasm and also are not suitable for making rapid improvement in tolerance to multiple stresses. Hence, molecular breeding offers the opportunity to increase the speed and efficiency of plant breeding (Whitford et al., 2010). It lays the foundation for modern crop improvement in the 21st century (Moose and Mumm, 2008) and simultaneously helps to identify superior gene combinations, leading to significant disease resilience. The term molecular breeding is used collectively for several breeding strategies, such as MAS, MABC, marker-assisted recurrent selection (MARS) and genomic selection (Ribaut et al., Molecular breeding explains the 2010). application of molecular biotechnological strategies on the basis of genotypic assays used either to improve or to alter plant traits (Jiang, 2013). Marker-assisted selection means selection of alleles of interest precisely and MABC is the incorporation of one or more alleles from one genetic background into another background, across all gene pools. Marker-assisted recurrent selection is the identification of several regions in the genome that are involved in complex trait expression and selection of those regions to accumulate favorable alleles from best genotypes within a single population or across related populations (Ribaut et al., 2010). Genomic selection is selection on the basis of genome-wide molecular markers linked with the trait of interest (Bernardo and Yu, 2007). Molecular breeding strategies reduce the crop selection cycles by increasing genetic gain per cycle; hence accumulating favorable alleles at target loci quickly (Delannay et al., 2012). Among molecular breeding approaches, all these approaches are widely and successfully used except genomic selection, which is at the beginning stages in plants (Cooper et al., 2006, Crosbie et al., 2006; Eathington et al., 2007). Molecular breeding approaches are most

commonly used by the private sector and by some national and international institutions (Dwivedi *et al.*, 2007; Ragot and Lee 2007) as adoption of molecular breeding approaches is hindered because of lack of resources at various levels, i.e., lack of high throughput capacity, analysis tools, information systems and technically expert personnel (Delannay *et al.*, 2012).

Major cereal crop i.e., rice, wheat and maize have been predominantly used as staple food around the world since time immemorial. Plant cultivar development and production are affected by several abiotic and biotic stresses all across the world (Wani et al., 2013; Pathak et al., 2014). Molecular breeding has led to development of plants resilient to various biotic (Roswarne et al., 2012, 2013, Yang et al., 2013) and abiotic stresses (Gosal et al., 2009). The potential applications of molecular breeding in crop plants for developing disease resilience have been well discussed by many (Babu et al., 2004, Jena et al., 2008; Collard and Mackill, 2008; Ibitoye and Akin-Idowu, 2010; Xu et al., 2013). Identification and mapping of several genes and quantitative trait loci (QTL) associated with abiotic and biotic stress tolerance in major cereals have provided an abundance of DNA marker-trait associations (Collard and Mackill, 2008) and have assisted conventional breeders to develop stress-tolerant cultivars with precision and in less time duration. Thus, efforts of plant breeders, molecular biologists and scientists in meeting the food requirements on a sustainable basis for ever-increasing population are facilitated. This review discusses various molecular breeding strategies and successful examples from cereals.

### MOLECULAR BREEDING STRATEGIES

### Marker assisted selection

The use of molecular markers for selection of plants carrying desirable genomic regions involved in the expression of a trait of interest governed by both major genes and QTL is referred to as marker-assisted selection (MAS) (Choudhary *et al.*, 2008). The term 'MAS' was first used by Beckmann and Soller (1986). Since

then, accelerated development and availability of molecular markers in plants have made MAS into a major molecular breeding strategy. Because of the general complexity of abiotic stress tolerance and the difficulty in phenotypic selection, MAS is considered an effective approach to improve tolerance. When a tightly linked marker which reliably predicts a trait phenotype is detected, it may be used for MAS. The MAS has several advantages over conventional phenotypic selection, i.e., it is quicker than phenotypic selection as desirable plants are selected at the seedling stage hence saving time, resources and efforts. With MAS, individual plants are selected based on their genotype. Prior to a breeding program and line/genotype development, DNA marker data allows certain applications i.e., assessment of genetic diversity, confirmation of hybrids, study of heterosis and identification of desirable genomic regions under selection (Collard and Mackill, 2008). Main important considerations of DNA markers in MAS include tightly linked marker (less than 5 centiMorgans (cM)), quantity and quality of DNA required in MAS, simplicity in marker assay procedure, cost effectiveness and highly polymorphic marker system (Collard and Mackill, 2008). Molecular marker systems have evolved during last decade (approximately 30 years) from hybridization based (1980s, restriction fragment length polymorphisms (RFLP)), PCR based markers (1990s i.e., random amplified polymorphic DNA (RAPD), and amplified fragment length polymorphism (AFLP), to present day markers of choice, e.g., simple sequence repeat (SSR) eand single nucleotide polymorphism (SNP). Discovery and introduction of efficient, high throughput and low-cost next generation sequencing (NGS) technologies have accelerated and revolutionized plant breeding. The NGS technologies are used for accelerating detection of genome-wide polymorphism (Mir and Varshney, 2013). These trends would accelerate the adoption of procedures, which require high density, genome-wide markers, such as genomic selection (Mir and Varshney, 2013).

Adoption and impact of MAS is still at early stages of DNA marker-technology development. For the success of MAS, the accuracy of QTL mapping is of utmost

importance. Factors like population size, level of replication used to generate phenotypic data, sampling bias and large confidence intervals have important implications for MAS, since the basis for selecting markers is accurate determination of the effect and position of a QTL. Other issues involved in successful MAS include insufficient linkage between marker and desirable gene/QTL, QTL x environment interaction effects. limited marker polymorphism, poor phenotyping system, high cost, application gap between plant breeding institutes and research laboratories and knowledge gap among plant breeders, scientists, molecular biologists and other disciplines, and resource limitations at various levels (Collard and Mackill, 2008; Xu and Crouch, 2008; Ribaut, Vicente and Delannay 2010; Delannay et al. 2012). What leads to increased adoption of MAS in plant breeding programs are rapid genomics research growth, new high-throughput marker genotyping platforms, a large number of markers and parallel development of userfriendly software and databases for storing of marker data and QTL data, e.g., 'Gramene' (http://www.gramene.org/, 'GrainGenes' (http://wheat.pw.usda.gov/GG3/) in cereals and database (http://www.maizegdb.org/) maize (Collard and Mackill, 2008).

# Marker-assisted backcross breeding (MABC)

Backcross is a most common breeding method used for incorporating one or several genes of interest into another variety. The recurrent parent used in backcrossing has a large number of desirable attributes but is deficient in only a few characteristics (Allard, 1999). Backcross breeding was popular in some crops during 1930-1960 (Stoskopf et al., 1993). Similarly, MABC aims to transfer one or more desirable genes/QTL from one genetic source (donor parent) into a superior, adapted, elite breeding line (which serves as a recurrent parent) to improve the targeted trait with the help of Unlike markers. traditional backcrossing, marker-assisted backcrossing is based on the marker alleles linked to gene(s)/QTL of interest instead of on phenotypic performance of target trait (Jiang, 2013). Marker-assisted backcrossing is known to improve the efficiency of backcross breeding when the phenotype of the gene of interest cannot be easily ascertained. Then the backcross (BC) progeny possessing a marker allele from donor parent at a locus near or within the desirable gene can be selected with good probability of carrying the gene. Markers can be used to select BC progeny with less of donor parent genome outside the desirable region and markers can be used to select rare progeny that are a result of recombination near the desirable gene, thus minimizing linkage drag (Babu *et al.*, 2004).

The MABC is accomplished in 3 levels (Holland, 2004). In the first level, known as 'foreground selection', markers are used for screening the target gene or QTL (Hospital and Charcosset, 1997). Foreground selection is used for screening recessive alleles, which is timeconsuming when conventional methods are used. Also selection is carried out at seedling stage, allowing selection of only those plants that carry the gene of interest and bypassing laborious procedures of phenotypic screening (Collard and Mackill, 2008). The second level of MABC, known as 'recombinant selection', involves selection of those backcross progenies that have had recombination events between the flanking markers and loci of interest. The size of introgression, i.e., the donor chromosome having the target locus, is reduced by this selection. In conventional backcross breeding. the chromosome segment from donor remains large even after many backcross generations (>10; Ribaut and Hoisington, 1998; Salina et al., 2003). However, in MABC, with the help of flanking markers (e.g., < 5 cM on either side of target gene), this donor chromosome segment (linkage drag) is reduced (Hospital, 2005). Recombinant selection is performed usually by using 2 backcross generations (Frisch et al., 1999b; Collard and Mackill, 2008) because double recombination events on both sides of target locus are usually rare. Then the third level of MABC, known as background selection, involves selecting backcross progenies with the maximum of recurrent parent genomic region by utilizing genome-wide dense molecular markers (Hospital and Charcosset, 1997; Frisch et al., 1999b). These genome-wide dense markers are not linked to target gene or QTL and hence

selection is carried against the donor genomic segment (Collard and Mackill, 2008). Hence, background selection is very useful in accelerating the recovery of the recurrent parent's genetic complement, which otherwise takes much longer (6 or more backcross generations) via the conventional backcross method (Collard and Mackill, 2008). In MABC, recurrent parent genome is recovered in BC<sub>2</sub> or BC<sub>3</sub>, BC<sub>4</sub> generation (Visscher *et al.*, 1996; Hospital and Charcosset 1997; Frisch *et al.*, 1999a, b).

Advantages of MAS (Collard and Mackill, 2008):

- allows selection for all kinds of traits at seedling stage only, thus it is faster and more accurate than phenotypic selection.
- is not influenced by genotype x environment interaction. Hence, it can be performed in greenhouse and off-season nurseries.
- is carried out using co-dominant markers, i.e., SSR and SNP, which allow selection of homozygous or heterozygous individuals.
- The presence of multiple genes governing a particular trait can be un-ambiguously established.

# Marker-assisted gene pyramiding (MAGP)

Assembling of more than 2 desirable genes from 2 or more donors into a single genotype or line for a specific trait is referred to as markerassisted gene pyramiding, which enhances trait performance by combining 2 or more complementary genes and rectifies deficits by introgression of genes from donor sources and hence increases the durability of disease resistance (Collard and Mackill, 2008). With the advent of molecular breeding, further new approaches, such as genomic selection and MARS are developed for overcoming the limitations of MAS, MABC, particularly when multiple QTL control the expression of complex traits.

### Marker-assisted recurrent selection (MARS)

Recurrent Selection is cyclical selection, evaluation and recombination in populations,

which aims to increase favorable allele frequency; and when markers are involved, it is called MARS, wherein genome dense markers linked with multiple favorable traits (gene/QTL) of interest from different sources are recognized and then selection is carried out based on genomic regions involved in complex trait expression so that best genotypes in a population are assembled (Ribaut et al., 2010). It allows selection at genotypic level and intermating for first selection cycle during same crop season and hence improves efficiency and accelerates the conventional selection (Jiang et al., 2007a). MARS allows phenotyping of F2-derived generations (i.e.,  $F_4$  or  $F_5$ ) and then genotyping of  $F_2$  or  $F_3$  (for estimating maker effect) followed by 2 to 3 cycles of recombination (Eathington et al., 2007) established on the basis of presence or absence of marker alleles for minor QTL. Identification of QTL is done from a base population which is developed by crossing superior lines. Further, lines possessing best, superior and required alleles for major QTL are crossed to accumulate those alleles in one background. Derived lines from crossing are screened on phenotypic basis for selecting superior lines for varietal development. Multiple major and minor QTL are captured as a result of MARS as compared with MABC, thus harnessing more genetic gain (Bernardo and Charcosset 2006). Thus, MARS is a forward breeding procedure for accumulating several QTL governing abiotic and biotic tolerance in crops (Ribaut et al., 2000; Ragot et al., 2000; Crosbie et al., 2006; Ribaut et al., 2010).

# Genomic selection

Concurrent selection of highly saturated genome-dense markers, some of which are expected to be in linkage disequilibrium with all genes in a genome is defined as genomic selection (Meuwissen, 2007). High throughput markers and novel statistical tools, along with highly efficient computing methods, are basic requirements for genomic selection. SNP markers and newer marker technologies have made genomic selection in plants feasible (Jiang 2013). Genotypic data made available from genome-wide dense markers are used to estimate complex traits, such as biotic resistance and

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abiotic tolerance, with much precision to allow selection on that estimation only. Selection of stress-resilient lines is established on the basis of values called genomic estimated breeding value (Nakaya and Isobe, 2012). The genomic estimated breeding values (GEBVs) are presumed values computed from novel statistical tools established on the basis of genome-dense highly saturated markers (Meuwissen *et al.*, 2001).

Prediction of the genetic merit of an individual is referred to as estimated breeding value (EBV). It is based on the concept that information on performance from offspring might more accurately indicate the real breeding value of an individual than using its own performance. EBVs are calculated on the basis of pedigree, performance of the individual (selection candidate) and progeny test results. Whereas genomic estimated breeding value (GEBV) is the prediction of the genetic merit of an individual based on its genome. GEBVs are estimated using the genomic relationship matrix (instead of the pedigree) in combination with the EBV or phenotypes of an individual. There is a wide variety of methods to estimate GEBVs that primarily differ in their assumptions about the genetic architecture of the trait of interest (Jonas and Koning, 2013). Statistical models, i.e., best linear unbiased prediction (BLUP), ridge and Bayes regression would help in prediction of genomic estimated breeding value in genomic selection (Nakaya and Isobe, 2012). Genotyping and phenotyping of individuals first takes place from training population and then data are subjected to statistical analyses. Then, genomic estimated breeding values are computed and selection of best individuals (validation population) is done to develop a breeding population. Figure 1 illustrates general concept of genomic selection. Also, the genomic estimated breeding values are calculated from marker effects rather than QTL effects (Goddard and Hayes, 2007).

Earlier genomic selection studies were carried out in animals (Jannink *et al.*, Iwata 2010; Goddard and Hayes, 2007), but now it is gaining importance in plants also (Guo *et al.*, 2011; Heffner *et al.*, 2010, 2011; Bernardo 2010; Bernardo and Yu 2007; Lorenzana and Bernardo 2009; Zhong *et al.*, 2009; Wong and Bernardo 2008). Genomic selection in plants was first demonstrated for maize, *Arabidopsis thaliana* and barley by Lorenzana and Bernardo (2009). Studies have demonstrated that genomic selection provides greater accuracy as compared with studies based on pedigree information only (Jannink *et al.*, 2010).

Genomic selection experiments in oil palm (population size of 50) gave good results than as compared from phenotypic selection and MARS in terms of time and gain per unit cost (Wong and Bernardo, 2008). Genomic selection is recognized as a novel, valuable and powerful tool for plant breeding programs now for developing abiotic and biotic stress-resilience in plants. However, lack of knowledge of statistics and simulation studies for practical use of genomic selection in plant breeding programs has limited popularity of this approach (Nakaya and Isobe, 2012), also limited resources for public sector breeding has prevented use of GS because gentoyping costs are huge. Breederfriendly and easily understandable software packages for genomic selection analysis and statistical formulae for estimation of genomic estimated breeding values need to be developed to facilitate and enhance application of genomic selection in plant breeding.

There are still some issues related to application of genomic selection when breeders must deal with thousands or more crosses or populations simultaneously (Jiang, 2013). Hence focus needs to be shifted towards additional applications of genomic selection; its usefulness needs to be demonstrated by practical and statistical ways instead of theoretical ways. Also cost effectiveness and precision of genomic selection need to be evaluated for it to be applied smoothly in practical plant breeding experiments (Heffner *et al.*, 2009).



Figure 1. General concept of genomic selection (GS).

### STRESS RESILIENCE IN CEREALS

#### Molecular breeding for biotic stresses in rice

Biotic stresses in rice, *i.e.*, blast, bacterial blight and plant hopper result in huge production losses. Resistance genes to combat these stresses have been introgressed through MAS into susceptible cultivars (Jena and Mackill, 2008).

### Blast resistance

Rice blast disease is a major biotic stress worldwide. Several DNA markers corresponding to major race-specific blast-resistance genes have been identified (Fjellstrom et al., 2004). Major gene resistance can be risky as evolution of new races of the pathogen breaks down the major gene resistance; thus, focus is given to partial resistance (Wisser et al., 2005; Wu et al., 2004). Considerable number of blast-resistance major genes have been identified and mapped. InDel and polymerase chain reaction (PCR) specific marker sets for several resistance genes are accessible for blast resistance molecular breeding (Hayashi et al., 2006). Marker-assisted pyramiding (MAP) of resistance genes Pi2 (using STMS marker, RM208) and Pi9 (using STMS marker, AP5930) from donors C101A51 Pi-2 and O. minuta P-9 in rice varieties 'Kalinga III' and 'Vandana' in Central Rice Research Institute (CRRI) Cuttack has been achieved to reduce susceptibility to blast. Likewise, pyramiding of genes Pil (using STMS marker, RM224), Pi2 (using STMS marker, RM208) and Pi4 (Pita) (using STMS marker, RM247) in cultivar 'CO39' in University of Agricultural Sciences, Bangalore using donors LAC23<sup>*Pi-1*</sup>,  $5173^{Pi-2}$  and Pai-kan-tao<sup>Pi-4</sup> resulted in new improved CO39<sup>Pi-1+P-2+P-4</sup> (Hittalmani *et al.*, 2000). The MABC has been successfully utilized in transferring blast-resistance genes Pi-Kh (using STMS marker, RM206) and Piz-5 (using STMS marker, AP5930) into the parental lines, i.e., Pusa 6B and PRR 78 of the popular superfine grain aromatic rice hybrid Pusa RH10. A simultaneous but stepwise transfer method was adopted for transferring the resistance genes Pi-kh (using STMS marker, RM206) and Piz 5 (using STMS marker, AP5930) from the donor Tetep and C101A51, respectively. The improved

versions of Pusa 6B and PRR 78 with 2 blastresistance genes *Pi-kh* and *Piz-5* each were achieved via MABC at the Division of Genetics, IARI, New Delhi (Prabhu *et al.*, 2009). The MABC was employed by Singh *et al.* (2012) to incorporate blast resistance into a popular highyielding aromatic rice hybrid, Pusa RH10 and its parents Pusa6B and PRR78 Blast-resistance genes, i.e., *Piz-5* (using STMS marker, AP5930) and *Pi54* (using STMS marker, RM206), from the donor lines C101A51 and Tetep were introgressed into PRR78 to develop Pusa1602 (PRR78 + *Piz5*) and Pusa1603 (PRR78 + *Pi54*) with linked molecular markers, AP5930 and RM206, respectively.

### Bacterial leaf blight resistance

Significant number of bacterial leaf blight (BLB) resistance genes have been identified using molecular markers, some of which have been cloned (Xa27, Xa26, Xa21, xa13, xa5, Xa1) (Jena and Mackill, 2008). Availability of numerous DNA markers linked with resistance genes enables incorporation and pyramiding of these genes into elite susceptible rice cultivars. Marker-assisted pyramidying has enabled development of indica rice cultivars incorporated with BB-resistance genes, i.e., Xa4 and Xa21 (Jena and Mackill 2008). Using MAS, resistance genes, xa5, xa13 and Xa21, have been pyramided into PR-106 (an *indica* rice cultivar) (Singh et al., 2001). Similarly, in the Philippines, combinations of Xa4, xa5 and Xa21 pyramided into 2 rice cultivars were (NSICRc142 and NSICRc154). Also same gene combination has been pyramided into another cultivar IR64 susceptible using MAS (Toenniessen et al., 2003). At Puniab Agricultural University (PAU) efforts were made for transferring blast-resistance genes, i.e., xa5 + xa13 + Xa21, into a popular rice cultivar PR-106 (Singh et al., 2001). Other examples include pyramiding of xa13 and Xa21 into Pusa Basmati 1 ('PB1') from IRBB55, using flanking Sequence Tagged Sites (STS) markers, RG136 and pTA248 (Joseph et al., 2004). Improved Pusa Basmati-1 ('IPB-1') was developed from Pusa Basmati-1 via MABC (Gopalakrishnan et al., 2008). Also, this same gene combination (xa5, xa13 and Xa21) was incorporated into

BPT5204 (Samba Mahsuri) and improved Samba Mahsuri was developed and released in India (Sundaram et al., 2008). Improvement of parental lines of a most popular aromatic rice hybrid, Pusa RH10, i.e., Pusa 6B and PRR 78. via MABC was achieved by incorporating resistance against bacterial blight by genes xa13 and Xa21 (Basavaraj et al., 2010) from donor improved Pusa Basmati-1 and by incorporating Pi-kh and Piz-5 against blast (Singh et al., 2012) from donors Tetep and C101A51. Production of basmati rice is mostly affected by BB, blast and sheath blight (ShB). Therefore, MABC was utilized to develop biotic stress-resilient basmati rice by using blast-resistance gene Pi54 and ShB resistance QTL, qSBR11-1 (from 'Tetep' used as donor parent) and BB resistance genes xa13 and Xa21 (from 'Improved Pusa Basmati 1', used as recurrent parent) (Singh et al., 2012).

### Brown plant hopper resistance

A significant number of genes have been identified for brown plant hopper (BPH) resistance. Land races, indica cultivars and several wild species, i.e., Oryza. minuta, O. australiensis and O. officinalis, usually serve as sources of resistance against brown plant hopper (Jena et al., 2006; Rahman et al., 2009). Finemapped genes, such as Bph21, bph20, Bph19, Bph18, Bph15, Bph14, Bph9, bph3, Bph2 and Bph1, have been utilized in BPH resistance MAS programs (Rahman et al., 2009; Zhang 2007; Jena et al., 2006; Chen et al., 2006; Sharma et al., 2003, 2004). In tropical indica and temperate japonica rice cultivars, genes Bph18 and Bph1, bph2 have been incorporated via MAS for brown plant hopper resistance (Jena et al., 2006). Bph1 and bph2 provide resistance to the evolved Japanese biotypes of BPH (Sharma et al., 2004). Also, enhanced resistance was provided by Bph18 to new Korean biotypes (Jena et al., 2006). Bph18 gene derived from O. australiensis was incorporated into an elite but highly susceptible japonica cultivar, Junambyeo via MABC (Suh et al., 2011).

# Molecular breeding for abiotic stresses in rice

Abiotic stresses, i.e., drought, submergence, cold stress and unproductive soils affect rice productivity. Traditional production and landraces of rice are potential sources of genes for tolerance to these stresses, but the transfer of genes from these useful sources is hindered by the complex nature of these traits (Jena and Mackill, 2008). However, OTLs responsible for tolerance to abiotic stresses discussed below have already been identified, thus allowing molecular breeding approaches for introgression into stress-susceptible rice varieties (Collard and Mackill, 2008; Steele et al., 2006).

# Drought tolerance

Molecular breeding approaches can accelerate breeding for drought tolerance in plants as it is a complex trait. At IRRI, Moroberekan and IR20 crosses were made during 1984 to identify lines with thick and deeper root system. Shashidhar et al. (2001) reported 2 flanking markers, i.e., OPBH14 and RM201, to be linked with long roots in rice. An upland rice variety, released as PY 84 (Birsa Vikas Dhan 111) in Jharkhand (Shashidhar et al., 2012), was bred using MABC by selecting for root QTL on chromosome 9 (using SSR markers RM242 - RM201) for increased root length under drought conditions. This variety was bred using MAS in combination with participatory or client-oriented breeding. This variety is drought tolerant, early maturing, high yielding and possesses good grain quality (Shashidhar et al., 2012). Also MABC and MAGP were used to incorporate QTL for root length and root thickness into Kalinga III (indica) for drought tolerance using Azucena (japonica) Philippines as donor parent (Steele et al., 2006). Flanking markers, RM242 and RM201, detected target segment on chromosome 9, which increased root length under drought stress (Steele et al., 2006). Plentiful QTLs for drought tolerance have been identified and markers are used to map and tag them for developing drought-resilience (Venuprasad et al., 2002). A QTL related to spikelet fertility under stress conditions was identified on chromosome 9 (Yue et al., 2006; Li et al., 2005; Courtois et al., 2000). 'Lemont' (japonica) when used as a donor parent in MABC provided drought tolerance to Teging'

(indica) (Xu et al., 2005). A OTL (DTY12.1) was identified by Bernier et al. (2007) on chromosome number 12 in Vandana/Way Rarem population. This QTL explained 51% of genetic variance and was mapped to 2.7 Mb using flanking SSR markers RM28048 and RM28166. Bernier et al. (2009) reported consistent effects of this OTL in target locations. Ghimire et al. (2012) reported a major-effect QTL, qDTY1.1, for grain yield under drought on chromosome 1 between markers RM431 and RM12091 in both populations (Dhagaddeshi × Swarna and Dhagaddeshi × IR64 populations). Several QTL reported, i.e, have been qDTY1.1 in Nagina22/Swarna and Nagina22/IR64 (Vikram et al., 2011) and qDTY6.1 in Apo/IR72 and Vandana/IR72 (Venuprasad et al., 2011).

### Submergence tolerance

In coastal areas, rice productivity is affected by submergence conditions caused by poor drainage and heavy rains. Mackill et al. (1996) reported that 15 M ha of area under rice in South Asia and South East Asia were submerged, resulting in losses of one billion US dollars. Rice varieties are easily adversely affected when submerged during early and vegetative stages; high mortality occurs within 5 to 7 days. Thus, introducing submergence-tolerant varieties for stabilizing rice productivity in rainfed areas is the utmost priority (Mackill et al., 1996). Sub1 QTL has been identified for submergence tolerance and fine mapped on rice chromosome number 9 in FR13A, a submergence-tolerant cultivar. This QTL accounts for 70% of phenotypic variation under stress conditions (Xu et al., 2000). The Sub1 gene is associated with the "ethylene response factors" gene family identified as Sub1 A, B and C. Varieties with Sub1 have less carbohydrate reduction and high alcohol. fermentation of thus providing sufficient energy for plant processes under submergence (Singh et al., 2011). Sub1 has been incorporated into "mega varieties" like Samba Mahsuri, IR64, Thadokkam 1 (TDK1), CR1009, BR11 and Swarna in India and Bangladesh via MABC for submergence tolerance (Xu et al., 2006; Neeraja et al., 2007, Septiningsih et al., 2009; Singh et al., 2009).

# Cold tolerance

Breeding for tolerance to low temperatures in rice during both vegetative and reproductive stages is an important breeding objective in temperate and highlands of subtropical and tropical areas (Jena and Mackill, 2008). Rice yields are affected by male sterility induced by cold stress. The booting stage in rice is most sensitive to low temperatures, causing degeneration of the young microspores and increasing in tapetal cell size (Saito et al., 2010). Several QTL for cold tolerance have been mapped in a population developed from M202 (japonica) and IR50 (indica) (Andaya and Mackill, 2003c). The QTL were mapped on chromosomes 11, 7 and 1 from Koshihikari (cold-tolerant japonica) and Akihikari (sensitive japonica) (Takeuchi et al., 2001). Also QTL for cold tolerance were mapped on chromosomes 11, 10, 5, 4 and 1 in near-isogenic line (NIL) population between a cold-tolerant japonica, Kunming x iaobaigu and a cold-sensitive japonica, Towada (Zeng et al., 2009; Xu et al., 2008. Significant QTL have been identified using different populations in different crosses (Andaya and Mackill, 2003b; Andaya and Mackill 2003a; Andaya and Tai 2006; Andaya and Tai 2007; Han et al., 2004; Lou et al., 2007), which lead to tolerance and hence are utilized in developing tolerant cultivars via molecular breeding approaches. Saito et al. (2010) mapped QTL Ctb1 to a 17-kb region containing 2 genes encoding an F-box protein expressed in young panicles and а (ser/thr) serine/threonine protein kinase expressed in leaves and young panicles cloned from a cold-tolerant variety, Norin-PL8 and then incorporated into a cold-sensitive variety, Hokkai241 and a line named BT4-74-8.

# Salinity tolerance

Rice cultivars are sensitive to saline environments; although some *indica* rice types, such as Kala-rata, Nona Bokra and Pokkali, can withstand salinity (Yeo *et al.*, 1990). Salinity tolerance again is a complex trait, which involves many processes, such as sodium discharge from roots, movement of sodium between shoots and roots and assimilation of sodium in vacuoles and older tissues (Thomson et al., 2007). There are numerous genes conferring tolerance to salinity, but Saltol QTL associated with the Na-K ratio under salinity stress (low Na<sup>+</sup> to K<sup>+</sup> ratio: high K<sup>+</sup> and low Na<sup>+</sup> adsorptions) is considered a major QTL for salinity tolerance at the seedling stage. Saltol is fine-mapped on short arm of chromosome 1 by use of flanking markers RM23 and RM140 from 80 recombinant inbred lines (RILs) developed from a cross between IR29 (sensitive) and Pokkali (tolerant). Saltol explained 64 to 80% of the phenotypic variance (Bonilla et al., 2002). It has also been detected in other varieties (Takehisa et al., 2004). Another OTL, SKC1 coding HKT-type transporters, controls K<sup>+</sup> homoeostatis under stress in tolerant varieties (Ren et al., 2005) and can be used for breeding salinity-tolerant cultivars. Thomson et al. (2010) analyzed 100 SSR markers in 140 IR29/Pokkali RILs, which confirmed the location of the Saltol OTL on chromosome 1 and identified additional QTL associated with tolerance, providing an opportunity for MABC to improve salinity tolerance of popular varieties, followed by marker-assisted gene pyramiding for areas with high salt stress.

# Tolerance to adverse soils

Quantitative trait loci for phosphorous, aluminum and iron deficiency and toxicity have been identified (Wissuwa et al., 2002; Nguyen et al., 2003; Mackill 2006). A major QTL Phosphorus uptake 1 (Pup1; derived from Kasalath) associated with phosphorous (P) uptake in deficient environments is mapped on chromosome 12 (Wissuwa et al., 1998). Pupl was placed in a 3-cM interval flanked by RFLP markers S14025 and S13126, which is within 1 cM of the position identified in the original QTL mapping experiment (Wissuwa et al., 2002). Kasalath was identified during an experiment consisting of 30 diverse rice genotypes in Japan in a phosphorous-deficient soil. A major gene *OsPSTOL1* (*Phosphorus starvation tolerance 1*) in this QTL enhances root growth. OsPSTOL1 encodes protein kinase [functional ser/thr], which resembles receptors, such as kinases (Gamuyao et al., 2012). Pup1 enhances P uptake (Wissuwa *et al.*, 2002) and increases yield (up to 4% higher grain weight plant<sup>-1</sup>) (Chin *et al.*, 2010). Kasalath and NILC443 have been used in breeding programs as donors for varieties, such as Batur, Dodokan and Situ Bagendit. NIL14-4 was used as the donor in crosses with IR64 and IR74 populations (Chin *et al.*, 2011).

# Molecular breeding for biotic stresses in wheat

Stem rust (*Puccinia graminis* Pers f. sp. *tritici* Eriks and Henn.), leaf rust (*Puccinia triticina*) and stripe rust (*Puccinia striiformis* West) are among major wheat diseases causing economic crises and resulting in significant yield losses all over the world (Sawhney 1994).

# Stem rust resistance in wheat

Stem rust of wheat caused by Puccinia graminis f. sp. tritici has been brought under control primarily by growing resistant varieties. The eradication of alternate hosts of stem rust pathogen also contributed to the control, especially in North America, by reducing early infections on wheat crop. Detection of Ug99 virulent race (Pretorius et al., 2000) with its further evolution and spread beyond eastern Africa poses new risks to production of wheat worldwide. Ug99 race, termed as TTKSK using North American nomenclature (Jin et al., 2007), possesses virulence to many known resistance genes used in breeding programs worldwide (Singh et al., 2008). In addition, Ug99 also possesses virulence to 2 additional important resistance genes, Sr31 and Sr38, transferred to wheat from rye (Secale cereale) and Triticum ventricosa, respectively. Winter wheat varieties possessing the wheat-rye translocation 1BL.1RS carrying the resistance gene Sr31, such as Kavkaz and Aurora, have been utilized in the development of Veery lines, which had significantly superior yield potential, wide adaptation and possessed tolerance to rust and powdery mildew conferred by resistance genes Lr26, Yr9, Sr31 and Pm8 located on the translocation (McIntosh et al., 1995). These CIMMYT-derived and many other 1BL.1RScarrying varieties spread so fast that by the

1990s stem rust seemed to have been wiped out. By 2005, Ug99 was well established in Ethiopia and Kenya (Wanyera *et al.*, 2006) and was identified in 2006 in Yemen and Sudan (Jin *et al.*, 2008).

Genomic selection has been very well reviewed in wheat for durable stem rust resistance (Rutkoski et al., 2011). Genomic selection has also been reported to improve quantitative adult plant resistance (APR) in a set of CIMMYT germplasm towards stem rust (Puccinia graminis f. sp. tritici). Prediction model, i.e., genomic-best linear unbiased prediction (G-BLUP), incorporated markers linked to main APR loci and the Sr2 region was found to play main role in APR (Rutkoski et al., 2014). Markers linked to moderate-effect gene loci, such as Sr2, could be predictive alone or modeled as fixed effects in combination with genome-wide markers, leading to better predictions to develop resilient varieties (Rutkoski et al., 2014). Also, Ornella et al. (2012) used genomic selection to accumulate favorable alleles of slow-rusting genes from 5 populations (PBW343/Juchi. wheat PBW343/Pavon76, PBW343/Muu. PBW343/Kingbird and PBW343/K-Nyangumi) by using 1400 Diversity Arrays Technology markers for assessing all parents and populations. Genomic selection was carried out using Bayesian least absolute shrinkage and selection operator (LASSO), ridge regression and support vector regression with linear or radial basis function kernel models to make better predictions for stem rust (Puccinia graminis) and yellow rust (Puccinia striiformis) resistant cultivars. Ornella et al. (2012) reported that prediction ability for yellow rust was lower than for stem rust, probably due to differences in infection conditions of both diseases. For within population and environment, the correlation between predicted and observed values (Pearson's correlation) was greater than 0.50 in 90% of the evaluation, whereas for yellow rust, the correlation ranged from 0.06 to 0.63. The LASSO and ridge regression models have similar prediction ability, with a slight superiority of the LASSO, indicating the additive nature of rust resistance.

Also, from Kristal/Sebatel durum wheat mapping population (RILs), 9 consistent QTL

regions conferring resistance to Ug99 were identified (Haile and Roder, 2013). The greatest portion of resistance for Ug99 in the population was explained by a QTL ( $R^2 = 34\%$ ) identified on short arm of chromosome 3B (OSr.IPK-3B) (Haile et al., 2012) due to the presence of the adult plant resistance gene, Sr2 mapped in same region of 3BS chromosome. From haplotype analysis based on expected fragment sizes of linked markers, the presence of Sr2 in 'Sebatel' (Haile et al., 2013b) was confirmed. 'Sebatel' variety was resistant to stem rust races in Syria, Lebanon and the Mediterranean region; it was developed at ICARDA (International Center for Agricultural Research in the Dry Areas) by accumulating resistance genes from multiple crosses and showed a high level of resistance. Hence, Sr2 contributes to adult plant resistance through the interaction between Sr2 and unknown genes to form a 'Sr2 complex' (Singh et al., 2009; Yu et al., 2011). Additionally, the QTL region identified on the long arm of chromosome 7A (Haile et al., 2012) flanked by Xbarc121 and Xgwm984 markers may be associated with the stem rust resistance gene Sr22, since Xbarc121 is among the reported diagnostic markers for this gene (Olson et al., 2010). Additional races belonging to Ug99 lineage have been found in East Africa, Zimbabwe and South Africa (Pretorius et al., 2010) and 7 races are now known (Hodson 2010). Therefore, breeding for rust resilience is the utmost priority for wheat breeders. Durable stem rust resistance has been made possible by deployment of Sr2 gene complex linked with morphological marker pseudo-black chaff (PBC) along with other minor genes. Sr2 was detected in CIMMYT-derived semi-dwarf wheats, e.g., Kritati, Kingbird, Pavon 76 and Parula (Njau et al., 2010). The Sr2 gene is tightly linked to the powdery mildew resistance and to leaf rust resistance gene Lr27 (Mago et al., 2011). By incorporating diverse resistance sources via MABC and by using co-segregating markers (Prins et al., 2001; Mago et al., 2005), selection is accelerated so that rust susceptibility of cultivars and germplasm is reduced.

### Leaf rust resistance

Various genes for leaf rust resistance have been incorporated into Triticum aestivum from several wild species, such as Aegilops ventricosa (Lr 37), A. speltoides (Lr 28, Lr 35, Lr 36, Lr 47), A. umbellulata (Lr 9), A. squarrosa (Lr 21, Lr 22, Lr 32, Lr 39, Lr 40, Lr 41, Lr 42, Lr 43) and Agropyron elongatum (Lr 19, Lr 24, Lr 29) (Prabhu et al., 2009). A number of Lr resistance genes, i.e., Lr 48, Lr 28, Lr 24, Lr 19 and Lr 9 are mapped and tagged on different wheat chromosomes with different markers viz., Lr9 with SCAR marker SCS5 on chromosome 6B<sup>L</sup>, Lr19 with SSR markers (Xgwm437, Xgwm421, Xgwm37) on chromosome 7D<sup>L</sup>, Lr24 with SCAR marker SCS1302 on chromosome 3D<sup>L</sup>, with SCAR marker SCS421 *Lr*28 on chromosome 4A<sup>L</sup> and Lr48 with RAPD marker S336776 on chromosome 2B<sup>L</sup> (Prabhu et al., 2009). Singh et al. (2001) reported that the APR is considered effective resistance for rust resistance breeding. Most of the resistance genes confer resistance in the seedling stage itself, enabling the plant to resist the invasion by the fungus during the entire growing period. The APR enables the plant to withstand the extreme effect of the infecting virulent pathogen via hypersensitive reaction as a consequence of the ability of the fungus to infect the plant. It is acknowledged that leaf rust control could be most effective if APR is utilized in combination with seedling resistance in wheat breeding programs (Pretorius and Roux 1988). The most prominent such example is of durable resistance conferred by the APR gene Lr34 (Wamishe and Milus 2004). In such an attempt, 3 pyramided wheat lines were developed to provide durable leaf rust resistance. One of them is HD 2329 (Lr9 + Lr24 + Lr28), a three-gene pyramid. Two two-gene pyramids, PBW 343 (Lr24 + Lr48) and PBW 343 (Lr28 + Lr48), were also developed in the prominent cultivar PBW343. The RAPD marker pair, S3450 and S336775, linked in repulsion and coupling phase, respectively, to the Lr48 locus has been utilized as a co dominant marker system (Prabhu et al., 2009). As MARS response is more in case of prior knowledge of the QTL and the response decreases as the knowledge of the number of minor QTL associated with the trait decreases

(Bernardo and Charcosset 2006). Tsilo *et al.* (2014) mapped genes for APR to leaf rust in a 139 recombinant inbred line MN98550-5/MN99394-1 population. Four QTL on chromosomes 2BS, 2DS, 7AL and 7DS were detected. The QTL on 2BS explained 33.6%, whereas other QTL on 2DS, 7AL and 7DS explained 15.7%, 8.1% and 34.2%, of the phenotypic variation, respectively. Deployment of these QTL in combination with other effective resistance genes will lead to effective and successful control of leaf rust.

### Stripe rust resistance

Many stripe rust resistance genes are known and DNA markers are associated with them, enabling their deployment in wheat breeding programs. Many researchers have identified seedling-stage stripe rust resistance genes, i.e., Yr5 (Smith et al., 2007; Chen et al., 2003; Yan et al., 2003; Sun et al., 2002), Yr7 (Yao et al., 2006), Yr17 ( Helguera et al., 2003), Yr10 (Smith et al., 2002), Yr9 (Shi et al., 2001), Yr15 (Peng et al., 2000), Yr26 (Ma et al., 2001) and Yr28 (Singh et al., 2000), have been deployed in improving wheat germplasm. Most resistance genes originate from wheat, but some have been introduced from related cereal species, too. Many of these alien introductions have the added value of being linked to genes, such as Yr9 linked to Lr26/Sr31/Pm8, which confer resistance against other fungal pathogens (Singh et al., 1990) and Yr17 linked to Lr37/Sr38 conferring resistance to all 3 rusts. Bariana and McIntosh 1994; Robert et al., 1999). Although Yr genes are identified on most of the wheat chromosomes, the B-genome, and in particular chromosome 2B, has maximum number of resistance genes (Luo et al., 2009). Among the resistance genes detected on 2B, Yr5 and Yr7 have been shown to be allelic (Zhang et al., 2009), whereas Yr27, Yr31, Yr41, Yr43, Yr44, YrQz (line Qz180; Deng et al., 2004) and YrV23 (cv. Vilmorin 23; Luo et al., 2009) represent potentially independent loci. Genes Yr24, YrCH42 and Yr26 are allelic, which are located on short arm of chromosome 1B (Li et al., 2006). However, Yr10 was shown to be independent, while Yrl5 was linked in repulsion

with Yr24/Yr26 (Zakari et al., 2003). Also the most popular example of molecular breeding is of employing marker-assisted backcross breeding to transfer Yr 15 to 'Zak' (Randhawa et al., 2009). Several APR genes have an important role in durable protection; for example, slowrusting Sr2/Yr30 complex showed durable disease resistance (Lowe *et al.*, 2011). Yr18/Lr34/Pm38 provides an important source of partial resistance (Krattinger et al., 2009). Yr29/Lr46/Pm39 combination provides effective resistance to both powdery mildew and rusts (Rosewarne et al., 2008; Lillemo et al., 2008).

Molecular markers are available for many APR genes; for example, 2 marker systems were developed viz., Microsatellite, SWM10 by Bossolini et al., 2006; and STS marker csLV34 by Lagudah et al., 2006 for Yr18, but these have since been superseded by the development of 5 allele-specific markers, cssfr1- cssfr5 (Lagudah et al., 2009). In addition, the Lr34/Yr18 locus has been cloned (Krattinger et al., 2009). Similarly, markers have been developed for APR genes, i.e., Yr29 (Suenaga et al., 2003) and Yr30 (Spielmeyer et al., 2003; Hayden et al., 2004). The SSR markers linked to Yr26 were used to transfer this gene successfully into the popular Turkish wheat cultivars, Gerek-79 and Gun-91 (Yildirim et al., 2004). To know the molecular and biochemical processes involved in the plant-pathogen interaction, molecular studies focused on cloning specific resistance genes. Genes Yr10, Yr18 and Yr36 have been cloned (McHale et al., 2006). More than 140 QTL have been identified for stripe rust resistance in wheat. About 47 regions have been identified that are effective against stripe rust and are dispersed across all chromosomes, except 5D (Rosewarne et al., 2013).

# Pre-harvest sprouting tolerance

A major QTL (*QPhs.ccsu* 3A.1) for pre-harvest sprouting tolerance (PHST) was identified and mapped on the long arm of chromosome 3A, which was transferred into wheat cultivar HD2329 (a pre-harvest sprouting-susceptible cultivar) from SPR8198 (a pre-harvest sprouting-tolerant cultivar) using MABC (Kulwal *et al.*, 2005). The 2 parents and the mapping population (RILs) developed from the cross were grown in 6 different environments and a linkage map (the length of the map being 279.1 cM) of chromosome 3A was prepared with 13 markers and used for OTL analysis. The major QTL, QPhs.ccsu-3A.1, was detected at a genetic distance of 183 cM (approximately) from the centromere on the long arm of chromosome 3A and the QTL explained 78.03% of the variation across environments (Kulwal et al., 2005). The positive additive effects of the QTL available in the superior parent (SPR8198) can be used for MAS for the transfer of this QTL allele to obtain PHS-tolerant cultivars. Four OPhs.caas-2BL, OPhs.caas-OTL. i.e., 3AS.1, QPhs.caas-3AS.2 and QPhs.caas-3AL, were identified from a cross between Zhongyou 206 and CA-0431 (white grain Chinese winter wheat line showing high PHS resistance). Line CA-0431 and the identified markers *Xbarc1042* and *Xmag3319* can be used in breeding programs for improvement of PHS resistance for white kernel wheat (Miao et al., 2013).

# Fusarium head blight resistance

Fusarium head blight (FHB) is a severe wheat disease (Leonard and Bushnell, 2003) and contamination caused by mycotoxins (fusarium secondary metabolites) pose a big threat to both human and animal health (Van Egmond, 2004). Molecular breeding studies for FHB resistance in wheat have led to the identification of 19 QTLs (Buerstmayr et al., 2009; Liu et al., 2009; Loffler et al., 2009), which are spread across all wheat chromosomes. A PCR-based marker, Umn10, linked to a major FHB resistance QTL (Fhb1) is located on the short arm of chromosome 3B, which explained 40% to 50% of phenotypic variance in an experiment (Rosyara et al., 2009; Liu et al., 2008). As a closely linked co-dominant molecular marker is an essential prerequisite for a successful Another major QTL from Wangshuibai mapped for FHB resistance is Fhb5, which is located on chromosome 5A (Xue al., 2011). et

# Molecular breeding for abiotic stresses in wheat

### Heat tolerance

Global temperature is predicted to increase by about 2 to 4 °C by the end of the 21<sup>st</sup> century (IPCC 2007). In cereal crops, heat stress plant development, including accelerates flowering time, and reduces anther dehiscence, pollen fertility rate, and grain filling, as well as the overall yield (Dwiyanti and Yamada 2013). Heat stress thresholds differ among plant species and cultivars (Wahid et al., 2007; Prasad et al., 2006). Heat tolerance is a quantitative trait, with complex nature and controlled by a number of genes/OTL, with interactions among OTL and QTL interaction with the environment (QTL  $\times$ QTL interaction;  $QTL \times environment$  and QTL $\times$  QTL  $\times$  environment interactions) (Kumar *et* al., 2013). Nevertheless, several stable OTL for heat tolerance in wheat have been reported for various parameters, such as grain filling duration (GFD) (Mason et al., 2010; Yang et al., 2002a), senescence-related traits (Vijavalakshmi et al., 2010). The QTL were identified on different chromosomes, i.e., 2B, 7B and 7D, using a cross between NW1014 (heat-tolerant) and HUW468 (heat-susceptible). These QTL governed the heat susceptibility index (HSI) for grain fill duration (HSIGFD); heat susceptibility index (HSI) for thousand grain weight (HSITGW) and canopy temperature depression (CTD) (Paliwal et al., 2012).

# Drought tolerance

A marker map (EST-STS/SSR) constructed by Kirigwi et al. (2007) from 127 RILs from a cross between Dharwar Dry (drought tolerant) and Sitta (drought susceptible). Kirigwi et al. (2007) reported a QTL for grain yield on the long arm of chromosome 4A. This QTL had impact on grains m<sup>2</sup>, grain-fill rate, grain yield, spike density, biomass production and drought susceptibility index. Microsatellite locus Xwmc89 was associated with all significant OTL covering a 7.7 cM region and generally explained the largest proportion of phenotypic variation. The alleles associated with enhanced

performance under drought stress were contributed by Dharwar Dry. Microsatellite marker wmc89 may be useful for MAS to enhance drought tolerance (Kirigwi et al., 2007). Kumar et al., 2012 identified several OTL for drought, i.e., QLt.ksu-1D, QFv/Fm.ksu-3B, QChl.ksu-3B and QGyp.ksu-4A, in cross between 'C306' and 'HUW206' for Lt (low flag leaf temperature under stress) on short arm of chromosome 1D; for potential quantum efficiency of photosystem (PS) II (Fv/Fm), chlorophyll content under stress, co-localized on chromosome 3B and for grain yield per plant on chromosome 4A.

# Molecular breeding for biotic stresses in maize

Biotic stresses, including downy mildews, banded leaf sheath blight, turcicum leaf blight, stem borers and abiotic stresses, i.e., drought, water logging and nutrient deficiencies and toxicity in soils have widespread yield-reducing effects on maize (Gerpacio and Pingali 2007). Many studies have reported identification and mapping of QTL associated with resilience, but practical applications of such QTL in resilience development are scarce. Identifying QTL that express uniformly across different genetic backgrounds would complement efforts in resilience development programs. Below are mentioned certain QTL that have been utilized in such programs.

# Downy mildew resistance

Development of resistance to downy mildew, especially for *Peronosclerospora sorghi*, *P. zeae*, *P. maydis*, *P. heteropogoni* and *P. philippinensis*, is given high priority throughout the world (Prasanna *et al.*, 2010b). Several QTL governing downy-mildew resistance have been identified and a significant one has been mapped on chromosome 6 using a set of 135 RILs developed from a cross between Ki3 (resistant) and CML139 (susceptible) (George *et al.*, 2003). In an Asian Maize Biotechnology Network (AMBIONET) study, these same 135 RIL families were evaluated for downy mildew reaction (during year 2000 and 2001) at different locations, i.e., Mandya (southern India) against sorghum downy mildew (P. sorghi); at Suwan (Thailand) against sorghum downy mildew (P. zeae); at Maros (Indonesia) against Java downy mildew (P. maydis); at Udaipur (western India) Rajasthan downy mildew against (*P*. heteropogoni); and at Southern Mindanao (Philippines) against Philippine downy mildew (P. philippinensis). Selection of QTL using genetic markers can be effective if a significant association is found between them. The AMBIONET study identified 3 SSR markers, i.e., umc11, umc23a and umc113, which were linked tightly to the QTL on chromosome 6, suggesting their possible use for MAS (Prasanna and Hoisington 2003). Also in India, a QTL each on chromosomes 3 and 6 was identified and validated from backcross mapping population developed from a cross between NAI116 (sorghum downy mildew resistant) and CM139 (susceptible) (Nair et al., 2005). Identification and subsequent mapping of major QTL helps in developing better DNA marker-trait associations (Collard and Mackill 2008), which can be utilized for successful application of MAS for the development of disease-resilience in susceptible cultivars.

# Turcicum leaf blight and polysora rust

Molecular-marker-assisted pyramiding of major genes governing resistance to turcicum leaf blight and polysora rust in elite 5 Indian inbred lines, i.e., CM137, CM138, CM139, CM140 and CM212, has been achieved at IARI (Prasanna et al., 2010a; Prasanna et al., 2009b). Turcicum leaf blight-resistance genes, i.e., Htn1and Ht2, along with a QTL (*RppQ*) for polysora rust from 4 resistant donors, i.e., NAI 147, SKV 21, NAI 112 and SKV18, were pyramided together by generating 7 different backcross populations. An SSR polymorphism survey was carried out on the selected donor and recipient parents covering all 10 chromosomes. Foreground selection (MABC) for different resistance gene combinations was carried out in BC1F1 and BC<sub>2</sub>F<sub>2</sub> generations using SSR markers (viz., umc1293, bnlg128 and umc1249), along with background selection for accelerated recovery of recurrent parent genome in BC1F1 and BC2F1

progenies. Phenotypic screening under artificial inoculation of  $BC_2F_1$  and  $BC_2F_3$  with local isolates was carried out at Hawalbagh (Almora) and Nagenahalli against turcicum leaf blight and against polysora rust at Nagenahalli. Differential responses of the genotypes to turcicum leaf blight at Hawalbagh and Naganahalli were revealed. The MABC enabled the development of  $BC_2F_4$  progenies with resistance to both the diseases, which led to the development of turcicum leaf blight- and polysora rust-resistant maize hybrids in India (Prasanna *et al.*, 2009b).

### Northern corn leaf blight resistance

Studies on resistance revealed the complex genetic nature of northern corn leaf blight (NCLB), with many QTL distributed genome wide (Van Inghelandt *et al.*, 2012; Poland *et al.*, 2011). Genomic selection in maize for prediction of NCLB resistance was employed by Technow *et al.* (2013) by using G-BLUP model to predict genotypic values of 100 dent and 97 flint lines, which were genotyped with high-density SNP markers and phenotyped for NCLB resistance *per se.* 

# Maize rough dwarf disease

Three major strains of virus cause maize rough dwarf disease (MRDD), which includes Mal de Rio Cuarto virus in South America, maize rough dwarf virus in Europe and rice black-streak dwarf virus in East Asia. Thus, it is a complex trait and resistance against it involves numerous QTL. The main approach for reducing yield losses from these viruses is to breed and deploy resilient maize cultivars. Mapping of a major QTL (*qMrdd*) to a 1.2 Mb region by Tao *et al.* (2013) would enable introgression of *qMrdd1*based resistance into susceptible but elite and well-adapted hybrids and hence would minimize MRDD-related crop losses.

# Molecular breeding for abiotic stresses in maize

### Drought tolerance

Maize is sensitive to drought mainly during reproductive stages. Studies on drought tolerance focused on genetic basis of root architecture, yield components and synchrony between anthesis and silking (Ribaut et al., 2009). The MABC procedure was used to incorporate several QTL alleles for short anthesis-silking interval (ASI) from Ac7643 (drought-tolerant) donor to CML247 (susceptible) (Ribaut and Ragot ,2007). A major QTL, identified as Root-ABA1, which is related to root development, along with abscisic acid levels in leaf under water stress, is also associated with stomatal conductance (Giuliani et al., 2005). Major OTL for deep roots have been identified in maize (Trachsel et al., 2009). A study on maize drought tolerance detected 239 QTL from 22 experiments under water stress and 160 QTL under control conditions (Hao et al., 2009). Later 39 consensus QTLs under water stress and 36 consensus OTLs under control conditions were identified (Hao et al., 2009). Genes related to stress response (i.e., NCED, a carotenoid cleavage enzyme and CBF1/DREB transcription factors) were identified within the detected meta-QTL. Recent trends and advances in molecular breeding have enabled detection of OTL and alleles associated with tolerance to drought. Such experiments in India and China (Prasanna et al., 2009a; Hao et al., 2008; Xiao et al., 2005) have led to the identification of OTL on different chromosomes (Prasanna et al., 2009a). Several QTL identified from RILs, located on chromosomes 1, 2, 8 and 10, were found to influence specific traits under drought stress. Also, a digenic epistatic QTL for kernel number per ear under drought stress was identified (Prasanna et al., 2010b). Analysis of a mapping population  $(F_{2:3})$  derived from a cross between drought-tolerant line X178 and a drought-susceptible line B73 [at the Chinese Academy of Agricultural Sciences (CAAS)] (Xiao et al., 2005; Hao et al., 2008) at different locations in central and southern China resulted in detection of a major QTL for ASI (anthesissilking interval) and ear number per plant under drought stress on chromosome 1 (bin 1.03) and (bins chromosome 9 9.03-9.05). which correspond to some major QTL identified in different experiments on drought stress worldwide (Tuberosa et al., 2007). Such

'consensus QTL' identified in maize for drought tolerance would be utilized in marker-assisted breeding programs as good candidates to improve maize production and productivity under drought conditions (Prasanna *et al.*, 2010b).

Several informative markers, e.g., SSR markers, have been identified for drought tolerance in maize (Gemenet et al., 2010; Shiri 2011). These informative markers could be further validated and potentially deployed in molecular breeding for developing drought tolerance in maize. Numerous QTL regulating morpho-physiological component traits, i.e., leaf greenness, plant senescence. and root capacitance under drought, and for grain yield have been reported in maize (Messmer et al., 2009, 2011; Li et al., 2010, 2011). Almeida et al. (2013) evaluated 3 tropical bi-parental (CML444 x MALAWI; CML440 x CML504; CML444 x CML441) populations under wellwatered and water-stress treatments in Kenya, Mexico and Zimbabwe to identify genomic regions responsible for grain yield and ASI. Meta-QTL analysis identified one genomic region for ASI and 7 regions for grain yield. From meta-OTL (mQTL) analysis, 7 genomic regions for grain yield and one genomic region for ASI were identified, of which 6 mOTL on chromosomes 1, 4, 5 and 10 for grain yield were constitutively expressed across environments and one mOTL on chromosome 7 for grain yield and one on chromosome 3 for ASI were found to be 'adaptive' to stress. An 'adaptive' QTL is one detected only in a specific environment, such as under water stress conditions, whereas a 'constitutive' QTL is consistently detected across most environments (Collins et al., 2008). The SNP markers were developed via high throughput assays for delimiting the physical intervals of these mQTL (Almeida et al., 2013). These mQTL regions can be effectively used in MAS and MARS programs for developing drought tolerance.

# Excess soil moisture tolerance in maize

Excess soil moisture (ESM) affects over 18 per cent of the total maize production area in South and Southeast Asia, causing production losses of 25 to 30 per cent annually (Zaidi et al., 2010). In India, water-logging is the second most serious constraint for crop production after drought. Significant QTL have been identified for waterlogging tolerance at seedling stage (Qiu et al., 2007). Mano et al. (2005) identified QTL on chromosomes 3, 7 and 8 for adventitious root formation under ESM conditions from an F<sub>2</sub> population of a cross between a maize inbred line (B64) and teosinte (Zea mays ssp. Huehuetenangensis). Similarly, Mano et al. (2009) identified QTL controlling constitutive aerenchyma formation under flooding conditions on chromosomes 1, 5 and 8 from a cross between another teosinte accession (Zea mavs spp. Nicaraguensis) and maize inbred line B73. The production of NILs with such QTL in maize would be beneficial for improvement of tolerance towards excess soil moisture. A QTL analysis to map the genes controlling adventitious root formation on the soil surface (ARF-SS) under flooding conditions was undertaken in the seedlings of 317 BC<sub>3</sub>F<sub>1</sub> progenies derived from a cross between elite maize Mi29 and teosinte (Zea nicaraguensis) (Mano et al., 2009). From interval mapping analysis and single point regression, the QTL for ARF-SS were detected on chromosomes 3 (bin 3.04), 7 (bin 7.04) and 8 (bin 8.03) (Mano et al., 2009). Six QTL (ph6-1, sdw4-1, sdw7-1, tdw4-1, tdw7-1 and rl1-2,) were identified at seedling stage, which were associated with plant height, shoot dry weight, total dry weight root length and root dry weight. These QTL were detected at 3 stages i.e., the period during 0 to 3 days of water logging, 3 to 6 days of water logging and the period during 6 to 9 days of water logging by Osman et al. (2013) After mapping of micro-RNAs and expressed sequence tag markers, 7 candidate genes were observed to co-localize with the identified QTL on chromosomes 1, 4, 6, 7 and 9 and hence these may be good candidate genes for ESM tolerance, which may be utilized in breeding programs.

### CONCLUSION

Molecular breeding offers numerous opportunities for plant breeders to develop cultivars with resilience to diseases with precision and rapidly. Molecular breeding approaches, such as MAS, MABC, MARS and genomic selection, have expanded the tool-kit of plant breeders and provided them with various avenues and opportunities. new These approaches have been adopted successfully in almost every crop listed in Table 1. We have covered some of the most successful examples from rice, wheat and maize for developing resilience to different biotic and abiotic stresses. Molecular breeding is an efficient approach for enhancing genetic gain per crop cycle. Molecular breeding and conventional breeding are complementary in most breeding programs, as there are various issues and bottlenecks that hinder molecular breeding strategies, especially in developing countries. These bottlenecks may non-availability include high cost. and complexity of molecular platforms, poor reliability of marker profiling and scoring, limited number of markers and degree of polymorphism, gene/QTL x environment effects, lack of equipment, resources and technical expertise as well as lack of application gap. Thus, to meet these challenges in molecular breeding, platforms (policies) need to be developed to reduce cost and to optimize MARS and genomic selection procedures to identify high-yielding, resilient and stable genotypes (with low genotype x environment x marker interaction). The emergence of public-private partnership platforms for accessing molecular breeding tools with support services and everincreasing demand for improved diseaseresilient varieties to counter the food crisis throughout the globe predict that molecular breeding strategies will have a significant impact on crop improvement programs prevailing in developing countries.

| Cereal | Trait(s)                               | Gene/QTL                               |                                | Remarks  | Reference                          |
|--------|--|--|--------------------------------|--|------------------------------------|
| Rice   | Blast<br>resistance                    | Pi39                                   | Fine mapped                    | On Chr. 12, Associated with<br>RM27933-RM27940   | Liu et al. 2007                    |
|        |  | Pi1, Piz-5, Pi1,<br>Pita               | Pyramiding in F2<br>generation | Associated with RFLP, STS  | Hittalmani <i>et al.</i><br>2000   |
|        | Bacterial<br>blight<br>resistance      | xa13                                   | Mapped                         | On Chr. 8 associated with markers E6A, SR6, SR11   | Chu <i>et al.</i> , 2006           |
|        | 10515141100                            | Xa27                                   | Mapped                         | On Chr. 6 associated with M964-<br>M1197   | Gu et al., 2005                    |
|        | BB resistance<br>and plant<br>height   | xa1, Xa21 and<br>sd1                   | Utilized in MABC               | Incorporated into Basmati370 and Basmati 386   | Bhatia <i>et al.</i> , 2011        |
|        | Green rice<br>leafhopper<br>resistance | Grh5                                   | Mapped                         | On chr. 8, associated with RM3754-RM3761   | Fujita <i>et al.</i> , 2006        |
|        | Deep roots                             | QTL on<br>chromosomes<br>1, 2, 7 and 9 | Utilized in MABC               | Using RFLP and SSR (forground)<br>SSR (background)   | Shen et al., 2001                  |
|        | Submergence tolerance                  | Sub1                                   | Mapped                         | On Chr. 9 associated with markers c1232, RZ698   | Xu et al., 2006                    |
|        | Salt stress                            | qST1, qST3,                            | Mapped                         | On Chr. 1, 3 associated with markers RZ569A, RZ596   | Lee et al., 2007                   |
|        |  | QTL                                    | Mapped                         | On Chr. 2,3,7 associated with markers C1408  | Takehisa <i>et al.,</i><br>2004    |
|        | Fe toxicity                            | LB1                                    | Mapped                         | On Chr. 1,2,4 associated with markers RM315, RM6, RM252  | Wan, Zhai, &<br>Wan 2005           |
|        | Rice yellow<br>mottle virus            | Rymv                                   | Mapped                         | On chr. 4, associated with RM273-<br>RM252   | Albar et al., 2003                 |
|        | Drought                                | QTL                                    | Identified                     | Kalinga III x Azucena for root<br>length   | Steele et al., 2006                |
|        |  |  | Identified                     | Vandana x WayRarem for<br>reproductive stage drought and<br>grain yield  | Bernier <i>et al.</i> , 2007       |
|        |  |  | Identified                     | Akihikari x IRAT109 for specific<br>water use and water use efficiency<br>(WUE)  | Kato et al., 2008.                 |
|        |  |  | Identified                     | Low land rice cv. Shennong 265 ×<br>Upland rice cv. Haogelao for<br>Photosynthesis parameters using<br>backcross (ILs) mapping<br>population | Gu et al., 2012                    |
| Wheat  | Powdery<br>mildew                      | Pm2 Pm4a                               | Pyramiding in F2               | Using RFLP   | Liu et al., 2000                   |
|        | Leaf rust                              | Lr1, Lr9, Lr24,<br>Lr47                | Marker assisted introgression  | Using STS, SCAR, CAPS  | Nocente, Gazza,<br>& Pasquini 2007 |
|        | PHST                                   | 1 QTL                                  | MABC                           | Using SSR, EST   | Torada <i>et al.</i> ,<br>2008     |
|        | FHB                                    | Fhb1 and<br>Qfhs.ifa-5A                | Transferred by MABC            | From spring wheat line CM82036<br>to European winter lines   | Salameh <i>et al.,</i><br>2011     |

|              | 1 Т | • .   | C      | 1    |       | C    | 1 1   |    | 1 1'     | C     | 1 1  |         |         |         | 1.   |        | •   | •     |       | 1   |
|--------------|-----|-------|--------|------|-------|------|-------|----|----------|-------|------|---------|---------|---------|------|--------|-----|-------|-------|-----|
| <b>Tohlo</b> |     | 101 / | ot ave | amnl | AC C  | mn   | 0011  | ar | hroading | tor   | DAVA | loning  | POC1 14 | anca tr | \ d1 | CARCAC | 1n  | maior | corog | 0   |
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|              |     |       |        |      |       |      |       |    |          |       |      |         |         |         |      |        |     |       |       |     |

| Cereal | Trait(s)<br>Durable | Gene/QTL<br>slow-rusting | Genomic selection | Remarks<br>Using 1400 Diversity Arrays     | Reference<br>Ornella <i>et al</i> |
|--------|---------------------|--------------------------|-------------------|--|-----------------------------------|
|        | resistance to       | genes identified         | (GS) in           | Technology markers and                     | 2012                              |
|        | the rust            | from five wheat          | (PBW343/Juchi,    | (LASSO), (BL), (RR) and support            |                                   |
|        |                     | populations              | PBW343/Pavon76,   | vector regression with linear or           |                                   |
|        |                     |                          | PBW343/Muu,       | radial basis function kernel models        |                                   |
|        |                     |                          | PBW343/Kingbird   |  |                                   |
|        |                     |                          | and PBW 343/K-    |  |                                   |
|        | Drought             | OTL                      | Identified        | Beaver x Soissons for flag leaf            | Verma et al 2004                  |
|        | Diougin             | QIL                      | Identified        | senescene                                  | Verina er an, 200-                |
|        |                     |                          | Identified        | SQ1 x Chinese Spring for root              | Quarrie et al.,                   |
|        |                     |                          |                   | length, WUE, grain yield                   | 2005                              |
|        |                     |                          | Identified        | Seri M82 $\times$ Babax for Various        | McIntyre et al.,                  |
|        |                     |                          |                   | productivity and physiological             | 2010;                             |
|        |                     |                          |                   | traits (RILs)                              | Suzuky <i>et al.</i> ,            |
|        |                     | OI t key 1D              | Identified        | In C306' x 'HI W206 for I t (low           | 2010<br>Kumar <i>et al.</i> 201   |
|        |                     | QL1.KSU-ID               | Identified        | flag leaf temperature under stress)        | Kulliai <i>et ul.</i> , 201       |
|        |                     |                          |                   | on short arm of chromosome 1D.             |                                   |
|        |                     | QFv/Fm.ksu-3B            | Identified        | In C306' x 'HUW206 for Fv/Fm               |                                   |
|        |                     | and                      |                   | and Chl controlling quantum                |                                   |
|        |                     | QChl.ksu-3B              |                   | efficiency of PS II and chlorophyll        |                                   |
|        |                     |                          |                   | content under stress were co-              |                                   |
|        |                     | OGvn ksu AA              | Identified        | In C306' x 'HI W206 for Grain              |                                   |
|        |                     | QOyp.KSu-4A              | Identified        | vield per plant on chromosome 4A           |                                   |
|        | Drought and         | OTL for Canopy           | Mapped            | On chromosome 2B, 5A, 4A, 1B               | Pinto et al., 2010                |
|        | heat                | Temperature              | 11                |  |                                   |
|        |                     | (CT),                    |                   |  |                                   |
|        |                     | Chlorophyll              |                   |  |                                   |
|        |                     | (Chl), Yield             | Manad             | On the second 7D 7D 2D                     | V                                 |
|        |                     | QIL for Stay-            | Mapped            | On chromosome /B, /D, 3B                   | Kumar <i>et al.</i> , 2010        |
| Maize  | Drought             | Root-abscisic            | Identified        | Os420 x IABO78                             | Landi <i>et al.</i> , 2007        |
|        | tolerance           | acid 1 (Root-            | 100111100         |  | 2007                              |
|        |                     | ABA1)                    |                   |  |                                   |
|        | Drought             | QTL                      | Identified        | Lo964 x Lo1016 for root traits and         | Tuberosa et al.,                  |
|        |                     |                          | - 1 - 101 - 1     | yield                                      | 2002                              |
|        |                     |                          | Identified        | F2 x F252 for silking data, grain          | Moreau,                           |
|        |                     |                          |                   | yield                                      | Charcosset, &                     |
|        |                     |                          | Identified        | CMI 444 × SC-Malawi for Plant              | Messmer <i>et al</i>              |
|        |                     |                          | Identified        | senescence. relative leaf                  | 2011                              |
|        |                     |                          |                   | chlorophyll                                | -                                 |
|        |                     |                          |                   | contents and root capacitance              |                                   |
|        | ~                   |                          | - 1 - 101 - 1     | (RILs)                                     |                                   |
|        | Chilling            | 8 QTL                    | Identified        | From ETH-DH7 $\times$ ETH-DL3, for         | Jompuk <i>et al.</i> ,            |
|        | tolerance           |                          |                   | Photosynthesis traits which                | 2005                              |
|        |                     |                          |                   | fluorescence CO <sub>2</sub> exchange rate |                                   |
|        |                     |                          |                   | (CER) and/or photosynthetic                |                                   |
|        |                     |                          |                   | pigments                                   |                                   |
|        | Borer               | QTL on                   | MABC              | Using RFLP                                 | Willcox et al.,                   |
|        | resistance          | chromosomes              |                   | -  | 2002                              |
|        |                     | 7, 9 and 10              |                   |  |                                   |
|        | Northarn agen       | 100 dent and 97          |                   | Using BLUP model and high-                 | Technow.                          |
|        | loof bli-bt         | flint line-              | Genomic Selection | donaity CND montor data                    | Dungana - 1 P                     |

### REFERENCES

- Albar L, Ndjiondjop MN, Essahak Z, Berger A, Pinel A, Jones M, Fargette D, Ghesquiere A (2003). Fine genetic mapping of a gene required for rice yellow mottle virus cell-tocell movement. *Theor. Appl. Genet.* 107: 371-378.
- Allard RW (1999). Principles of plant breeding. Wiley, New York.
- Almeida GD, Makumbi D, Magorokosho C, Nair S, Borem A, Ribaut JM, Banziger M, Prasanna BM, Crossa J, Babu R (2013). QTL mapping in three tropical maize populations reveals a set of constitutive and adaptive genomic regions for drought tolerance. *Theor. Appl. Genet.* 126: 583-600.
- AndayaVC, Mackill DJ (2003a). QTLs conferring cold tolerance at the booting stage of rice using recombinant inbred lines from a japonica  $\times$  indica cross. *Theor. Appl. Genet.* 106: 1084-1090.
- Andaya VC, Mackill DJ (2003c). QTLs conferring cold tolerance at the booting stage of rice using recombinant inbred lines from a japonica x indica cross. *Theor. Appl. Genet.* 106: 1084-1090.
- Andaya VC, Mackill DJ (2003b). Mapping of QTLs associated with cold tolerance during the vegetative stage in rice. *J. Exp. Bot.* 54:2579-2585.
- Andaya VC, Tai TH (2006). Fine mapping of qCTS12 locus, a major QTL for seedling cold tolerance in rice. *Theor. Appl. Genet.* 113: 467-475.
- Andaya VC, Tai TH (2007). Fine mapping of the qCTS4 locus associated with seedling cold tolerance in rice (*Oryza sativa* L.). *Mol. Breed.* 20: 349-358.
- Babu R, Nair SK, Prasanna BM, Gupta HS (2004). Integrating marker-assisted selection in crop breeding – Prospects and challenges. *Current science* 87(5): 601-619.
- Bariana HS, McIntosh RA (1994). Characterisation and origin of rust and powdery mildew resistance genes in VPM1 wheat. *Euphytica* 76: 53-61.
- Basavaraj SH, Singh VK, Singh A, Singh A, Yadav S, Ellur RK, Singh D, Gopala Krishnan S, Nagarajan M, Mohapatra T, Prabhu KV, Singh AK (2010). Marker assisted improvement of bacterial blight resistance in parental lines of PusaRH10, a superfine grain aromatic rice hybrid. *Mol. Breed.* 2: 293-305.

- Beckmann JS, Soller M (1986). Restriction fragment length polymorphisms and genetic improvement of agricultural species. *Euphytica* 35: 111-124.
- Bernardo R (2010). Genome wide selection with minimal crossing in self-pollinated crops. *Crop Sci.* 50: 624-627.
- Bernardo R, Charcosset A (2006). Usefulness of gene information in marker-assisted recurrent selection: a simulation appraisal. *Crop Sci.* 46: 614-21.
- Bernardo R, Yu J (2007). Prospects for genome wide selection for quantitative traits in maize. *Crop Sci.* 47: 1082-1090.
- Bernier J, Kumar A, Venuprasad R, Spaner D, Verulkar S, Mandal NP, Sinha PK, Peeraju P, Dongre PR, Mahto RN, Atlin GN (2009). Characterization of the effect of rice drought tolerance *qtl*12.1 over a range of environments in the Philippines and eastern India. *Euphytica* 166: 207-217.
- Bernier J, Kumar A, Ramaiah V, Spaner D, Atlin G (2007). A large effect QTL for grain yield under reproductive-stage drought stress in upland rice. *Crop Sci.* 47: 507-518.
- Bhatia D, Sharma R, Vikal Y, Mangat GS, Mahajan R, Sharma N, Lore JS, Singh N, Bharaj TS, Singh K (2011). Marker-assisted development of bacterial blight resistant, dwarf and high yielding versions of two traditional basmati rice cultivars. *Crop Sci.* 51: 759-770.
- Bonilla P, Dvorak J, Mackill DJ, Deal K, Gregorio G (2002). RFLP and SSLP mapping of salinity tolerance genes in chromosome 1 of rice (*Oryza sativa* L.) using recombinant inbred lines. *Philipp. Agric. Sci.* 85: 68-76.
- Bossolini E, Krattinger SG, Keller B (2006). Development of simple sequence repeat markers specific for the *Lr*34 resistance region of wheat using sequence information from rice and *Aegilops tauschii*. *Theor. Appl. Genet.* 113: 1049-1062.
- Buerstmayr H, Ban T, Anderson JA (2009) QTL mapping and marker-assisted selection for Fusarium head blight resistance in wheat: a review. *Plant Breed* 128: 1-26.
- Chen JW, Wang L, Pang XF, Pan QH (2006). Genetic analysis and fine mapping of a rice brown plant hopper (*Nilaparvata lugens* Stal.) resistance gene *bph19. Mol. Genet. Genomics* 275: 321-329.
- Chen XM, Soriac MA, Yan G, Sun J, Dubcovsky J (2003). Development of sequence tagged site and cleaved amplified polymorphic sequence markers for wheat stripe rust

resistance gene Yr5. Crop Sci. 43: 2058-2064.

- Chin JH, Gamuyao R, Dalid C, Bustamam M, Prasetiyono J, Moeljopawiro S, Wissuwa M, Heuer S (2011). Developing rice with high yield under phosphorus deficiency: *Pup1*sequence to application. *Plant Physiology* 156(3): 1202-1216.
- Chin JH, Lu X, Haefele SM, Gamuyao R, Ismail A, Wissuwa M, Heuer S (2010). Development and application of gene-based markers for the major rice QTL *Phosphorus uptake 1*. *Theor. Appl. Genet.* 120: 1073-1086.
- Choudhary K, Choudhary OP, Shekhawat NS (2008). Marker assisted selection: a novel approach for crop improvement *American-Eurasian Journal of Agronomy* 1(2): 26-30.
- Chu Z, Yuan M, Yao J, Ge X, Yuan B, Xu C, Li X, Fu B, Li Z, Bennetzen ZL, Zhang Q, Wang S (2006). Promoter mutation of an essential gene for pollen development results in disease resistance in rice. *Genes Dev.* 20: 1250-1255.
- Collard, BCY, Mackill DJ. (2008). Marker-assisted selection: an approach for precision plant breeding in the twenty-first century. *Philos. Trans. R. Soc. Lond. B Biol. Sci.* 363: 557-572.
- Collins NC, Tardieu F, Tuberosa R (2008). Quantitative trait loci and crop performance under abiotic stress: where do we stand? *Plant Physiol.* 147: 469-486.
- Cooper M, Smith OS, Merrill RE, Arthur L, Polich DW, Loffler CM (2006). Integrating breeding tools to generate information for efficient breeding: past, present and future. *In Plant Breeding: The Arnel R. Hallauer International Symposium*. pp. 141-154.
- Courtois B, McLaren G, Sinha PK, Prasad K, Yadav R, Shen L (2000). Mapping QTLs associated with drought avoidance in upland rice. *Mol. Breed.* 6: 55-66.
- Crosbie TM, Eathington SR, Johnson GR, Edwards M, Reiter R, Stark S, Mohanty RG, Oyervides M, Buehler RE, Walker AK, Dobert R, Delannay X, Pershing JC, Hall MA, Lamkey KR (2006). Plant breeding: past, present and future. In: K.R. Lamkey and M. Lee, eds., *In Plant Breeding: The Arnel R. Hallauer International Symposium.* pp. 3-50.
- Delannay X, McLaren G, Ribaut JM (2012). Fostering molecular breeding in developing countries. *Mol. Breeding* 29: 857-873.
- Deng ZY, Zhang XQ, Wang XP, Jing JK, Wang DW (2004). Identification and molecular

mapping of a stripe rust resistance gene from a common wheat line QZ180. *Acta Botanica Sinica* 46: 236-241.

- Dwivedi SL, Crouch JH, Mackill DJ, Xu Y, Blair MW, Ragot M, Upadhyaya HD, Ortiz R (2007). The molecularization of public sector crop breeding: progress, problems and prospects. *Adv. Agron.* 7: 3-8.
- Dwiyanti MS, Yamada T (2013). Molecular mapping and breeding for genes/QTLs related to climate change. In: C. Kole, eds., Genomics and breeding for climate-resilient crops Vol. 1 Concepts and strategies. Springer, Verlag Berlin Heidelberg, pp.183-184.
- Eathington SR, Crosbie TM, Edwards MD, Reiter RS, Bull JK (2007). Molecular markers in commercial breeding. *Crop Sci.* 47: 154-163.
- Fjellstrom R, Conaway-Bormans CA, McClung AM, Marchetti MA, Shank AR, Park WD (2004). Development of DNA markers suitable for marker-assisted selection of three *Pi* genes conferring resistance to multiple *Pyricularia grisea* pathotypes. *Crop Sci.* 44: 1790-1798.
- Frisch M, Bohn M, Melchinger AE (1999a). Comparison of selection strategies for marker-assisted backcrossing of a gene. Crop Sci. 39: 1295-1301.
- Frisch M, Bohn M, Melchinger AE (1999b). Minimum sample size and optimal positioning of flanking markers in markerassisted backcrossing for transfer of a target gene. *Crop Sci.* 39: 967-975.
- Fujita D, Doi K, Yoshimura A, Yasui H (2006). Molecular mapping of a novel gene, *Grh5*, conferring resistance to green rice leafhopper (*Nephotettix cincticeps* Uhler) in rice, *Oryza sativa* L. *Theor. Appl. Genet.* 113: 567-573.
- Gamuyao R, Chin JH, Pariasca-Tanaka J, Pesaresi P, Catausan S, Dalid C, Slamet-Loedin I, Tecson-Mendoza EM, Wissuwa M, Heuer S (2012). The protein kinase *Pstol1* from traditional rice confers tolerance of phosphorus deficiency. *Nature* 23, 488(7412): 535-539.
- Gemenet DC, Wachira FN, Pathak RS, Munyiri SW (2010). Identification of molecular markers linked to drought tolerance using bulked segregant analysis in Kenyan maize (*Zea mays* L.) landraces. *Journal of Animal Plant Sciences* 9(1): 1122-1134.
- George MLC, Prasanna BM, Rathore RS (2003). Identification of QTLs conferring resistance to downy mildews of maize in Asia. *Theor. Appl. Genet.* 107: 544-551.

- Gerpacio RV, Pingali PL (2007). Tropical and subtropical maize in Asia: production systems, constraints and research priorities. CIMMYT, Mexico DF.
- Ghimire KH, Quiatchon LA, Vikram P, Swamy BPM, Dixit S, Ahmed HU, Hernandez JE, Borromeo TH, Kumar A (2012). Identification and mapping of a QTL (*qDTY1.1*) with a consistent effect on grain yield under drought. *Field Crops Res.* 131: 88-96.
- Giuliani S, Sanguineti MC, Tuberosa R, Bellotti M, Salvi S, Landi P (2005). Root ABA1, a major constitutive QTL, affects maize root architecture and leaf ABA concentration at different water regimes. *Journal of Experimental Botany* 56(422): 3061-3070.
- Goddard ME, Hayes BJ (2007). Genomic selection. J. Anim. Breed. Genet. 124: 323-330.
- Gopalakrishnan S, Sharma RK, Rajkumar KA, Joseph M, Singh VP, Singh AK, Bhat KV, Singh NK, Mohapatra T (2008). Integrating marker assisted background analysis with foreground selection for identification of superior bacterial blight resistant recombinants in Basmati rice. *Plant Breed*. 127: 131-139.
- Gosal SS, Wani SH, Kang MS (2009). Biotechnology and drought tolerance. *Journal of Crop Improvement* 23: 19-54.
- Gu J, Yin X, Struik PC, Stomph TJ, Wang H (2012). Using chromosome introgression lines to map quantitative trait loci for photosynthesis parameters in rice (*Oryza sativa* L.) leaves under drought and well-watered field conditions. *Journal of Experimental Botany* 63(1): 455-469.
- Gu K, Yang B, Tian D, Wu L, Wang D, Sreekala C, Yang F, Chu Z, Wang G, White FF, Yin Z (2005). *R* gene expression induced by a type-II effector triggers disease resistance in rice. *Nature* 435: 1122-1125.
- Guo Z, Tucker DM, Liu J, Kishore V, Gay G (2011). Evaluation of genome wide selection efficiency in maize nested association mapping populations. *Theor. Appl. Genet.* 124: 261-275.
- Haile JK, Roder MS (2013). Status of genetic research for resistance to Ug99 race of *Puccinia graminis* f. sp. *tritici*: a review of current research and implications. *African Journal of Agricultural Research* 8(50): 6670-6680.
- Haile JK, Hammer K, Badebo A, Singh RP, Roder MS (2013b). Haplotype analysis of molecular markers linked to stem rust

resistance genes in Ethiopian improved durum wheat varieties and tetraploid wheat landraces. *Genet. Resour. Crop Evol.* 60: 853-864.

- Haile JK, Nachit MM, Hammer K, Badebo A, Roder MS (2012). QTL mapping of resistance to race Ug99 of *Puccinia graminis* f. sp. *tritici* in durum wheat (*Triticum durum* Desf.). *Mol. Breed.* 30: 1479-1493.
- Han LZ, Qiao YL, Cao G, Zhang Y, An Y, Ye J, Koh HJ (2004). QTL analysis of cold tolerance during early growth period for rice. *Rice Sci*. 11: 245-250.
- Hao Z, Li X, Xie C (2008). Two consensus quantitative trait loci clusters controlling anthesis-silking interval, ear setting and grain yield might be related with drought tolerance in maize. *Ann. Appl. Biol.* 153: 73-83.
- Hao Z, Li X, Liu X, Xie C, Li M, Zhang D, Zhang S (2009). Meta-analysis of constitutive and adaptive QTL for drought tolerance in maize. *Euphytica* 174: 165-177.
- Hayashi K, Yoshida H, Ashikawa I (2006). Development of PCR based allele specific and InDel marker sets for nine rice blast resistance genes. *Theor. Appl. Genet.* 113: 251-260.
- Hayden MJ, Kuchel H, Chalmers KJ (2004). Sequence tagged microsatellites for the Xgwm533 locus provide new diagnostic markers to select for the presence of stem rust resistance genes *Sr2* in bread wheat (*Triticum aestivum* L.). *Theor. Appl. Genet.* 109:1641-1647.
- Heffner EL, Lorenz AJ, Jannink JL, Sorrells ME (2010). Plant breeding with genomic selection: gain per unit time and cost. *Crop Sci.* 50: 1681-1690.
- Heffner EL, Jannink JL, Iwata H, Souza E, Sorrells ME (2011). Genomic selection accuracy for grain quality traits in biparental wheat populations. *Crop Sci.* 51: 2597-2606.
- Heffner EL, Sorrells ME, Jannink JL (2009). Genomic selection for crop improvement. *Crop Sci.* 49: 1-12.
- Helguera M, Khan IA, Kolmer J, Lijavetzky D, Zhongqi L, Dubcovsky J (2003). PCR assays for the *Lr37-Yr17-Sr38* cluster of rust resistance genes and their use to develop isogenic hard red spring wheat lines. *Crop Sci.* 43: 1839-1847.
- Hittalmani S, Parco A, Mew TV, Zeigler RS, Huang N (2000). Fine mapping and DNA marker assisted pyramiding of the three major genes

for blast resistance in rice. *Theor. Appl. Genet.* 100: 1121-1128.

- Hodson DP (2010). Shifting boundaries: challenges for rust monitoring. In: R. McIntosh and Z. Pretorius, eds., Proceedings of BGRI 2010 Technical Workshop. St Petersburg, Russia, 30-31 May 2010, pp.103-118.
- Holland JB (2004) Implementation of molecular markers for quantitative traits in breeding programs-challenges and opportunities. In Proc. 4th Int. Crop Sci. Congress. Brisbane, Australia, 26 September-1 October.
- Hospital F (2005). Selection in backcross programmes. *Phil. Trans. R. Soc. B.* 360: 1503-1511.
- Hospital F, Charcosset A (1997). Marker-assisted introgression of quantitative trait loci. *Genetics* 147: 1469-1485.
- Ibitoye DO, Akin-Idowu PE (2010). Marker-assistedselection (MAS): A fast track to increase genetic gain in horticultural crop breeding. *African Journal of Biotechnology* 9(52): 8889-8895.
- Ismail AM, Heuer S, Thomson MJ, Wissuwa M (2007). Genetic and genomic approaches to develop rice germplasm for problem soils. *Plant Mol. Biol.* 65: 547-570.
- Jannink JL, Lorenz AJ, Iwata H (2010). Genomic selection in plant breeding: from theory to practice. *Briefings in Functional Genomics* 9: 166-177.
- Jena KK, Mackill DJ (2008). Molecular Markers and Their Use in Marker-Assisted Selection in Rice. *Crop Sci.* 48: 1266-1276.
- Jena KK, Jeung JU, Lee JH, Choi HC, Brar DS (2006). High-resolution mapping of a new brown planthopper (BPH) resistance gene, *Bph18(t)* and marker-assisted selection for BPH resistance in rice (*Oryza sativa* L.). *Theor. Appl. Genet.* 112: 288-297.
- Jiang GL (2013). Molecular markers and marker assisted breeding in plants. In: S.B. Anderson eds., Plant Breeding from Laboratories to Fields. InTech, Croatia, pp. 45-83.
- Jin Y, Pretorius ZA, Singh RP (2007). New virulence within race TTKS (*Ug99*) of the stem rust pathogen and effective resistance genes. *Phytopathology* 97: S137 (Abstract).
- Jin Y, Pretorius ZA, Singh RP, Fetch JT (2008). Detection of virulence to resistance gene *Sr24* within race TTKS of *Puccinia graminis* f. sp. *tritici. Plant Disease* 92: 923-926.
- Jompuk C, Fracheboud Y, Stamp P, Leipner J (2005). Mapping of quantitative trait loci associated

with chilling tolerance in maize (*Zea mays* L.) seedlings grown under field conditions. *J. Exp. Bot.* 56: 1153-1163.

- Jonas E, Koning DJD (2013). Does genomic selection have a future in plant breeding? *Trends in Biotechnology* 31(9): 497-504.
- Joseph M, Gopala Krishnan S, Sharma RK, Singh AK, Singh VP, Singh NK, Mohapatra T (2004). Combining bacterial blight resistance and Basmati quality characteristics by phenotypic and molecular marker assisted selection in rice. *Mol. Breed*.13: 377-387.
- Kato Y, Hirotsu S, Nemoto K, Yamagishi J (2008). Identification of QTL controlling rice drought tolerance at seedling stage in hydroponic culture. *Euphytica* 160(3): 423-430.
- Kirigwi FM, Ginkel MV, Brown Guedira G, Gill BS, Paulsen GM, Fritz AK (2007). Markers associated with a QTL for grain yield in wheat under drought. *Mol Breeding* 20: 401-413.
- Krattinger SG, Lagudah ES, Spielmeyer W, Singh RP, Huerta-Espino J, McFadden H, Bossolini E, Selter LL, Keller B (2009). A putative ABC transporter confers durable resistance to multiple fungal pathogens in wheat. *Science* 323: 1360-1363.
- Kulwal PL, Kumar N, Gaur A, Khurana P, Khurana J, Tyagi AK, Balyan HS, Gupta PK (2005). Mapping of a major QTL for pre-harvest sprouting tolerance on chromosome 3A in bread wheat. *Theor. Appl. Genet.* 111: 1052-1059.
- Kumar A, Atlin GN (2009). Identification and characterization of large-effect quantitative trait loci for grain yield under lowland drought stress in rice using bulk-segregant analysis. *Theor. Appl. Genet.* 120: 177-190.
- Kumar S, Kumari P, Kumar U, Grover M, Singh AK, Singh R, Sengar RS (2013). Molecular approaches for designing heat tolerant wheat. J. Plant Biochem. Biotechnol. 22(4): 359-371.
- Kumar S, Sehgal SK, Kumar U, Vara Prasad PV, Joshi AK, Gill BS (2012). Genomic characterization of drought tolerance-related traits in spring wheat. *Euphytica* 186(1): 265-276.
- Kumar U, Joshi AK, Kumari M, Paliwal R, Kumar S, Roder MS (2010). Identification of QTLs for stay green trait in wheat (*Triticum aestivum* L.) in the 'Chirya 3' × 'Sonalika' population. *Euphytica* 174: 437-445.

- Lagudah ES, McFadden H, Singh RP, Huerta-Espino J, Bariana HS, Spielmeyer W (2006). Molecular genetic characterization of the *Lr*34/*Yr*18 slow rusting resistance genes region in wheat. *Theor. Appl. Genet.* 114: 21-30.
- Lagudah ES, Krattinger SG, Herrera-Foessel S, Singh RP, Huerta-Espino J, Spielmeyer W (2009). Gene-specific markers for the wheat gene *Lr34/Yr18/Pm38* which confers resistance to multiple fungal pathogens. *Theor. Appl. Genet.* 119: 889-898.
- Landi P, Sanguineti MC, Liu C, Li Y, Wang TY, Giuliani S, Bellotti M, Salvi S, Tuberosa R (2007). Root-ABA1 QTL affects root lodging, grain yield and other agronomic traits in maize grown under well-watered and water-stressed conditions. *Journal of Experimental Botany* 58(2): 319-326.
- Lee SY, Ahn JH, Cha YS, Yun DW, Lee MC, Ko JC, Lee KS, Eun MY (2007). Mapping QTLs related to salinity tolerance of rice at the young seedling stage. *Plant Breed*.126: 43-46.
- Leonard KJ, Bushnell WR (2003). Fusarium head blight of wheat and barley. American Phytopathological Society (APS Press), St. Paul, Minnesota.
- Li GQ, Li ZF, Yang WY, Zhang Y, He ZH, Xu SC (2006). Molecular mapping of stripe rust resistance gene *YrCH42* in Chinese wheat cultivar Chuanmai 42 and its allelism with *Yr24* and *Yr26*. *Theor. Appl. Genet.* 112: 1434-1440.
- Li WJ, Liu ZZ, Shi YS, Song YC, Wang TY, Xu CW, Li Y (2010). Detection of consensus genomic region of QTL relevant to droughttolerance in maize by QTL meta-analysis and bioinformatics approach. *Acta Agron Sin.* 36: 1457-1467.
- Li Y, Yang M, Dong Y, Wang Q, Zhou Y, Zhou Q, Shen B, Zhang F, Liang X (2011). Three main genetic regions for grain development revealed through QTL detection and metaanalysis in maize. *Mol. Breed.* 30(1): 195-211.
- Li Z, Mu P, Li C, Zhang H, Li Z, Gao Y, Wang X (2005). QTL mapping of root traits in a doubled haploid population from a cross between upland and lowland japonica rice in three environments. *Theor. Appl. Genet.* 110: 1244-1252.
- Lian XM, Xing YZ, Yan H, Shu CG, Li XH, Zhang QF (2005). QTLs for low nitrogen tolerance at seedling stage identified using a recombinant inbred line population derived

from an elite rice hybrid. *Theor. Appl. Genet.* 112: 85-96.

- Lillemo M, Asalf B, Singh RP, Huerta-Espino J, Chen XM, He ZH, Bjornstad A (2008). The adult plant rust resistance loci *Lr34/Yr18* and *Lr46/Yr29* are important determinants of partial resistance to powdery mildew in bread wheat line Saar. *Theor. Appl. Genet.* 116: 1155-1166.
- Liu J, Liu D, Tao W, Li W, Wang S, Chen P, Cheng S, Gao D (2000). Molecular markerfacilitated pyramiding of different genes for powdery mildew resistance in wheat. *Plant Breed.* 119: 21-24.
- Liu S, Pumphrey MO, Gill BS, Trick HN, Zhang JX, Dolezel J, Chalhoub B, Anderson JA (2008.) Towards positional cloning of fhb1, a major QTL for fusarium head blight resistance in wheat. *Cereal Res. Comm.* 36(6): 195-201.
- Liu SY, Hall MD, Griffey CA, McKendry AL (2009). Meta-analysis of QTL associated with Fusarium head blight resistance in wheat. *Crop Sci.* 49: 1955-1968.
- Liu X, Yang Q, Lin F, Hua L, Wang C, Wang L, Pan Q (2007). Identification and fine mapping of *Pi*39(t), a major gene conferring the broad-spectrum resistance to *Magnaporthe oryzae*. *Mol. Genet. Genomics* 278: 403-410.
- Loffler M, Schon CC, Miedarter T (2009). Revealing the genetic architecture of FHB resistance in hexaploid wheat (*Triticum aestivum* L.) by QTL meta-analysis. *Mol. Breed.* 23: 473-488.
- Lorenzana RF, Bernardo R (2009). Accuracy of genotypic predictions for marker-based selection in biparental plant populations. *Theor. Appl. Genet.* 120: 151-161.
- Lou Q, Chen L, Sun Z, Xing Y, Li J, Mei X, Xu H, Luo L (2007). A major QTL association with cold tolerance at seedling stage in rice (*Oryza sativa* L.). *Euphytica* 158: 87-94.
- Lowe I, Cantu D, Dubcovsky J (2011). Durable resistance to the wheat rusts: integrating systems biology and traditional phenotypebased research methods to guide the deployment of resistance genes. *Euphytica* 179: 69-79.
- Luo PG, Hu X, Zhang H, Ren Z (2009). Genes for resistance to stripe rust on chromosome 2B and their application in wheat breeding. *Prog. Nat. Sci.* 19: 9-15.
- Ma J, Zhou R, Dong Y, Wang L, Wang X, Jia J (2001). Molecular mapping and detection of the yellow rust resistance gene *Yr*26 in wheat transferred from *Triticum turgidum* L.

using microsatellite markers. *Euphytica* 120: 219-226.

- Mackill DJ (2006). Breeding for resistance to abiotic stresses in rice: The value of quantitative trait loci. In K.R. Lamkey and M. Lee, eds., Plant breeding: The Arnel R. Hallauer international symposium. Blackwell, Ames, IA. pp. 201-212.
- Mackill DJ, Coffman WR, Garrity DP (1996). Rainfed Lowland Rice Improvement. International Rice Research Institute, Los Banos, Philippines, pp. 242.
- Mago R, Bariana HS, Dundas IA, Spielmeyer W, Lawrence GJ, Pryor AJ (2005). Development of PCR markers for the selection of wheat stem rust resistance genes *Sr*24 and *Sr*26 in diverse wheat germplasm. *Theor. Appl. Genet.* 111: 496-504.
- Mago R, Tabe L, McIntosh RA, Kota ZPR, Paux E, Wicker T, Breen J, Lagudah ES, Ellis JG, Spielmeyer W (2011). A multiple resistance locus on chromosome arm 3BS in wheat confers resistance to stem rust (*Sr2*), leaf rust (*Lr27*) and powdery mildew. *Theor. Appl. Genet.* 123(4): 615-23.
- Mano Y, Omori F, Loaisiga CH, Bird RM (2009). QTL mapping of aboveground adventitious roots during flooding in maize x teosinte "Zea nicaraguensis" backcross population. Plant Root 3: 3-9.
- Mano Y, Omori F, Muraki M, Takamizo T (2005). QTL mapping of adventitious root formation under flooding conditions in tropical maize. *Breed. Sci.* 55: 343-347.
- Mason RE, Mondal S, Beecher FW, Pacheco A, Jampala B, Ibrahim AMH, Hays DB (2010). QTL associated with heat susceptibility index in wheat (*Triticum aestivum* L.) under short-term reproductive stage heat stress. *Euphytica* 174: 423-436.
- McHale L, Tan X, Koehl P, Michelmore RW (2006). Plant NBS-LRR proteins: adaptable guards. *Genome Biology* 7: 212.
- McIntosh RA, Wellings CR, Park RF (1995). Wheat rusts: an atlas of resistance genes. CSIRO Publications, Victoria, Australia.
- McIntyre CL, Mathews KL, Rattey A, Chapman SC, Drenth J, Ghaderi M, Reynolds M, Shorter R (2010). Molecular detection of genomic regions associated with grain yield and yield-related components in an elite bread wheat cross evaluated under irrigated and rainfed conditions. *Theoretical and Applied Genetics* 120: 527-541.
- Messmer R, Fracheboud Y, Banziger M, Vargas M, Stamp P, Ribaut JM (2009). Drought stress

and tropical maize: QTL-by-environment interactions and stability of QTL across environments for yield components and secondary traits. *Theor. Appl. Genet.* 119: 913-930.

- Messmer R, Fracheboud Y, Banziger M, Stamp P, Ribaut JM (2011). Drought stress and tropical maize: QTLs for leaf greenness, plant senescence and root capacitance. *Field Crops Research* 124: 93-103.
- Meuwissen T (2007). Genomic selection: marker assisted selection on a genome wide scale. J. Anim. Breed. Genet. 124: 321-322.
- Meuwissen THE, Hayes BJ, Goddard ME (2001). Prediction of total genetic value using genome wide dense marker maps. *Genetics* 157: 1819-1829.
- Miao, X.L., Y.J. Zhang, X.C. Xia, Z.H. He, Y. Zhang, J. Yan, X.M. Chen. 2013. Mapping quantitative trait loci for pre-harvest sprouting resistance in white-grained winter wheat line CA 0431. Crop and Pasture Science 64(6): 573-579.
- Mir RR, Varshney RK (2013). Future prospects of molecular markers in plants. In: Molecular markers in plants, R.J. Henry, eds., Blackwell Publishing Ltd., Oxford, UK, pp: 169-190.
- Moose SP, Mumm RH (2008). Molecular plant breeding as the foundation for 21st century crop improvement. *Plant Physiol.* 147(3): 969-977.
- Moreau L, Charcosset A, Gallais A (2004). Use of trial clustering to study QTL3 environment effects for grain yield and related traits in maize. *Theor. Appl. Genet.* 110: 92-105.
- Nair SK, Prasanna BM, Garg A (2005). Identification and validation of QTLs conferring resistance to sorghum downy mildew (*Peronosclerospora sorghi*) and Rajasthan downy mildew (*P. heteropogoni*) in maize. *Theor. Appl. Genet.* 110: 1384-1392.
- Nakaya A, Isobe SN (2012). Will genomic selection be a practical method for plant breeding? *Annals of Botany*. DOI:10.1093/aob/mcs109.???
- Neeraja CN, Maghirang-Rodriguez R, Pamplona A, Heuer S, Collard BCY, Septiningsih EM, Vergara G, Sanchez D, Xu K, Ismail AM, Mackill DJ (2007). A marker-assisted backcross approach for developing submergence -tolerant rice cultivars. *Theor. Appl. Genet.* 115: 767-776.
- Nguyen BD, Brar DS, Bui BC, Nguyen TV, Pham LN, Nguyen HT (2003). Identification and mapping of the QTL for aluminum tolerance

introgressed from the new source, *Oryza rufipogon* Grff., into *indica* rice (*Oryza sativa* L.). *Theor. Appl. Genet.* 106: 583-593.

- Njau PN, Jin Y, Huerta-Espino J, Keller B, Singh RP (2010). Identification and evaluation of sources of resistance to stem rust race Ug99 in wheat. *Plant Disease* 94: 413-419.
- Nocente F, Gazza L, Pasquini M (2007). Evaluation of leaf rust resistance genes *Lr*1, *Lr*9, *Lr*24, *Lr*47 and their introgression into common wheat cultivars by marker-assisted selection. *Euphytica* 155: 329-336.
- Olson EL, Brown-Guedira G, Marshall D, Stack E, Bowden RL, Jin Y, Rouse M, Pumphrey MO (2010). Development of wheat lines having a small introgressed segment carrying stem rust resistance gene *Sr22*. *Crop Sci.* 50: 1823-1830.
- Ornella L, Singh S, Perez P, Burgueno J, Singh R, Tapia E (2012). Genomic prediction of genetic values for resistance to wheat rusts. The Plant Genome 5: 136-148.
- Osman KA, Tang B, Wang Y, Chen J, Yu F, Li L, Han X, Zhang Z, Yan J, Zheng Y, Yue B, Qiu F (2013). Dynamic QTL Analysis and Candidate Gene Mapping for Waterlogging Tolerance at Maize Seedling Stage. *PLoS ONE* 8(11):e79305.
- Paliwal R, Roder MS, Kumar U, Srivastava JP, Joshi AK (2012). QTL mapping of terminal heat tolerance in hexaploid wheat (*T. aestivum* L.). *Theor. Appl. Genet.* 125: 561-575.
- Pathak MR, Teixeira da Silva JA, Wani SH (2014). Polyamines in response to abiotic stress tolerance through transgenic approaches. *GM Crops* 5(1): 1-10.
- Peleg Z, Fahima T, Krugman T, Abbo S, Yakir D, Korol AB, Saranga Y (2009). Genomic dissection of drought resistance in durum wheat × wild emmer wheat recombinant inbred line population. *Plant, Cell and Environment* 32: 758-779.
- Peng JH, Fahima T, Roder MS, Li YC, Grama A, Nevo E (2000). Microsatellite high-density mapping of the stripe rust resistance gene YrH52 region on chromosome 1B and evaluation of its marker-assisted selection in the F<sub>2</sub> generation in wild emmer wheat. *New Phytologist* 146: 141-154.
- Phillips RL (2006). Genetic tools from nature and the nature of genetic tools. *Crop* Sci. 46: 2245-2252.
- Pinto RS, Reynolds MP, Mathews KL, McIntyre CL, Olivares-Villegas JJ, Chapman SC (2010). Heat and drought adaptive QTL in a wheat

population designed to minimize confounding agronomic effects. *Theor. Appl. Genet.* 121(6): 1001-1021.

- Poland JA, Bradbury PJ, Buckler ES, Nelson RJ (2011). Genome-wide nested association mapping of quantitative resistance to northern leaf blight in maize. *Proc. Natl. Acad. Sci. USA.* 108(17): 6893-6898.
- Prabhu KV, Singh AK, Basavaraj SH, Cherukuri DP, Charpe A, Gopala Krishnan S, Gupta SK, Joseph M, Koul S, Mohapatra T, Pallavi JK, Samsampour D, Singh A, Singh VK, Singh A, Singh VP (2009). Marker assisted selection for biotic stress resistance in wheat and rice. *Indian J. Genet.* 69(4): 305-314.
- Prasad PVV, Boote KJ, Allen LH, Jr JE, Sheehy, Thomas JMG (2006). Species, ecotype and cultivar differences in spikelet fertility and harvest index of rice in response to high temperature stress. *Field Crops Res.* 95: 398-411.
- Prasanna BM, Hoisington D (2003). Molecular breeding for maize improvement: an overview. *Indian Journal of Biotechnology* 2: 85-98.
- Prasanna BM, Pixley K, Warburton ML, Xie CX (2010b). Molecular marker-assisted breeding options for maize improvement in Asia. *Mol. Breeding* 26: 339-356.
- Prasanna BM, Beiki AH, Sekhar JC, Srinivas A, Ribaut JM (2009a). Mapping QTLs for component traits influencing drought stress tolerance of maize in India. J. Plant Biochem. Biotech. 18: 151-160.
- Prasanna BM, Hettiarachch K, Mahatman K, Rajan A, Singh ON, Kaur B, Kumar B, Gowda KTP, Pant SK, Kumar S. (2009b).
  Molecular marker-assisted pyramiding of genes conferring resistance to Turcicum leaf blight and Polysora rust in maize inbred lines in India. In: Proceedings of 10<sup>th</sup> Asian regional maize workshop (October 20-23, 2008, Makassar, Indonesia). CIMMYT, Mexico DF.
- Prasanna BM, Mahatman KH, Rajan A, Singh ON, Kaur B, Zaidi PH, Azrai M, Pixley KN (2010a). Molecular marker-assisted pyramiding of genes conferring resistance to Turcicum leaf blight and Polysora rust in maize inbred lines in India. In: Proceedings of 10<sup>th</sup> Asian regional maize workshop (October 20-23, 2008, Makassar, Indonesia). CIMMYT, Mexico DF.
- Pretorius ZA, Roux JL (1988). Occurrence and pathogenecity of *Puccinia recondita* f. sp.

*Tritici* in South Africa during 1986 and 1987. *Phytophylactica* 22: 225-228.

- Pretorius ZA, Bender CM, Visser B, Terefe T (2010). First report of a *Puccinia graminis* f. sp. *Tritici* race virulent to the Sr24 and Sr31 wheat stem rust resistance genes in South Africa. *Plant Disease* 94: 784.
- Pretorius ZA, Singh RP, Wagoire WW, Payne TS (2000). Detection of virulence to wheat stem rust resistance gene Sr31 in Puccinia graminis f. sp. tritici in Uganda. Plant Disease 84: 203.
- Prins R, Groenewald JZ, Marias GF, Snape JW, Koebner RMD (2001). AFLP and STS tagging of *Lr*19, a gene conferring resistance to leaf rust in wheat. *Theor. Appl. Genet.* 103: 618-624.
- Qiu F, Zheng Y, Zhang Z, Xu S (2007). Mapping of QTL associated with waterlogging tolerance during the seedling stage in maize. *Ann. Bot.* 99: 1067-1081.
- Quarrie SA, Steed A, Calestani C, Semikhodskii A, Lebreton C, Chinoy C, Steele N (2005). A high-density genetic map of hexaploid wheat (*Triticum aestivum* L.) from the cross Chinese Spring x SQ1 and its use to compare QTLs for grain yield across a range of environments. *Theor. Appl. Genet.* 110(5): 865-880.
- Ragot M, Lee M (2007). Marker-assisted selection in maize: current status, potential, limitations and perspectives from the private and public sectors. In Marker-assisted selection: current status and future perspectives in crops livestock forestry and fish. Food and Agriculture Organization of the United Nations, Rome, pp.117-150.
- Ragot M, Gay G, Muller JP, Durovray J (2000). Efficient selection for the adaptation to the environment through QTL mapping and manipulation in maize. In: J.M. Ribautm and D. Poland, eds., Molecular approaches for the genetic improvement of cereals for stable production in water-limited environments. CIMMYT, Mexico, pp. 128-130.
- Rahman ML, Jiang W, Chu SH, Qiao Y, Ham TH, Woo MO, Lee J, Khanam MS, Chin JH, Jeung JU, Brar DS, Jena KK, Koh HJ (2009). High-resolution mapping of two rice brown planthopper resistance genes *Bph20*(t) and *Bph21*(t) originating from *Oryza minuta. Theor. Appl. Genet.* 119: 1237-1246.
- Randhawa HS, Mutti JS, Kidwell K, Morris CF, Chen X, Gill KS (2009). Rapid and targeted

introgression of genes into popular wheat cultivars using marker-assisted background selection. *PLoS ONE* 4:e5752.

- Ren Z, Gao J, Li L, Cai X, Huang W, Chao D, Zhu M, Wang Z, Luan S, Lin H (2005). A rice quantitative trait locus for salt tolerance encodes a sodium transporter. *Nat. Genet.* 37: 1141-1146.
- Ribaut JM, Hoisington D (1998). Marker-assisted selection: new tools and strategies. *Trends Plant Sci.* 3: 236-239.
- Ribaut JM, Ragot M (2007). Marker-assisted selection to improve drought adaptation in maize: the backcross approach, perspectives, limitations and alternatives. *J. Exp. Bot.* 58: 351-360.
- Ribaut JM, Jiang C, Hoisington D (2002). Simulation experiments on efficiencies of gene introgression by backcrossing. *Crop Sci.* 42: 557-565.
- Ribaut JM, Edmeades G, Perotti E, Hoisington D (2000). QTL analysis, MAS results and perspectives for drought-tolerance improvement in tropical maize. In: J.M. Ribaut and D. Poland, eds., Molecular approaches for the genetic improvement of cereals for stable production in water-limited environments. CIMMYT, Mexico, pp. 131-136.
- Ribaut JM, Betran J, Monneveux P, Setter T (2009). Drought tolerance in maize. In: Handbook of maize. J.L. Bennetzen and S.C. Hake, eds., Springer, New York, pp. 311-344.
- Ribaut JM, Vicente MC, Delannay X (2010). Molecular breeding in developing countries: challenges and perspectives. *Curr. Opin. Plant Biol.* 13: 1-6.
- Robert O, Abelard C, Dedryver F (1999). Identification of molecular markers for the detection of the yellow rust resistance gene *Yr*17 in wheat. *Mol. Breed.* 5: 167-175.
- Rosewarne GM, Singh RP, Huerta-Espino J, Rebetzke GJ (2008). Quantitative trait loci for slow-rusting resistance in wheat to leaf rust and stripe rust identified with multi environment analysis. *Theor. Appl. Genet.* 116: 1027-1034.
- Rosewarne GM, Singh RP, Huerta-Espino J, Herrera-Foessel SA, Forrest KL, Hayden MJ, Rebetzke GJ (2012). Analysis of leaf and stripe rust severities reveals pathotype changes and multiple minor QTLs associated with resistance in an Avocet × Pastor wheat population. *Theor. Appl. Genet.* 124: 1283-1294.

- Rosewarne GM, Herrera-Foessel SA, Singh RP, Huerta-Espino J, Lan CX, He ZH (2013). Quantitative trait loci of stripe rust resistance in wheat. *Theor. Appl. Genet.* 126: 2427-2449.
- Rosyara UR, Gonzalez-Hemandez JE, Glover KD, Gedye KR, Stein JM (2009). Family-based mapping of quantitative trait loci in plant breeding populations with resistance to Fusarium head blight in wheat as an illustration. *Theor. Appl. Genet.* 118: 1617-1631.
- Rutkoski JE, Heffner EL, Sorrells ME (2011). Genomic selection for durable stem rust resistance in wheat. *Euphytica* 179: 161-173.
- Rutkoski JE, Poland JA, Singh RP, Huerta-Espino J, Bhavani S, Barbier H, Rouse MN, Jannink JL, Sorrells ME (2014). Genomic selection for quantitative adult plant stem rust resistance in wheat. *The plant genome* 7(3): 1-10.
- Saito K, Hayano-Saito Y, Kuroki M, Sato Y (2010). Map-based cloning of the rice cold tolerance gene *Ctb*1. *Plant Sci.* 179: 97-102.
- Salameh A, Buerstmayr M, Steiner B, Neumayer A, Lemmens M, Buerstmayr H (2011). Effects of introgression of two QTL for fusarium head blight resistance from Asian spring wheat by marker-assisted backcrossing into European winter wheat on fusarium head blight resistance, yield and quality traits. *Mol. Breeding* 28: 485-494.
- Salina E, Dobrovolskaya O, Efremova T, Leonova I, Roder MS (2003). Microsatellite monitoring of recombination around the *Vrn-B1* locus of wheat during early backcross breeding. *Plant Breed.* 122: 116-119.
- Sawhney RN (1994). Kundan a superior wheat cultivar among the dwarf wheats. *Indian Farming* 43: 35-36.
- Septiningsih EM, Pamplona AM, Sanchez DL, Maghirang-Rodriguez R, Neeraja CN, Vergara GV, Heuer S, Ismail AM, Mackill DJ (2009). Development of submergencetolerant rice cultivars: the Sub1 gene and beyond. Ann. Bot. 103: 151-160.
- Sharma PN, Torii A, Takumi S, Mori N, Nakamura C (2004). Marker-assisted pyramiding of brown planthopper (*Nilaparvata lugens* Stal.) resistance genes Bph1 and bph2 on rice chromosome 12. *Hereditas* 140: 61-69.
- Sharma PN, Ketipearachchi Y, Murata K, Torii A, Takumi S, Mori N, Nakamura C (2003). RFLP/AFLP mapping of a brown planthopper (*Nilaparvata lugens* Stal.)

resistance gene Bph1 in rice. *Euphytica* 129: 109-117.

- Shashidhar HE, Kanbar A, Toorchi M, Raveendra GM, Kundur P, Vimarsh HS, Soman R, Kumar NG, Bekele BD, Bhavani P (2012). Breeding for drought resistance using whole plant architecture - conventional and molecular approach. In: S.B. Andersen, eds., Plant breeding from laboratories to fields. ISBN: 978-953-51-1090-3, InTech, DOI: 10.5772/54983.
- Shashidhar HE, Sharma N, Venuprasad R, Toorchi M, Chandrashekar M, Kanbar A, Hittalmani S (2001). Two DNA markers for maximum root length in rice validated across mapping populations and wide germplasm accessions. 8th National Rice Biotechnology Network Meeting, Aurangabad, pp.47-50.
- Shen L, Courtois B, McNally KL, Robin S, Li Z (2001). Evaluation of near-isogenic lines of rice introgressed with QTLs for root depth through marker-aided selection. *Theor. Appl. Genet.* 103: 75-83.
- Shi ZX, Chen XM, Line RF, Leung H, Wellings CR (2001). Development of resistance gene analog polymorphism markers for the *Yr9* gene resistance to wheat rust. *Genome* 44: 509-516.
- Shiri M (2011). Identification of informative simple sequence repeat (SSR) markers for drought tolerance in maize. *African Journal of Biotechnology* 10(73): 16414-16420.
- Singh A, Singh VK, Singh SP, Ellur RK, Choudhary V, Sarkhel S, Singh D, GopalaKrishnan S, Nagarajan M, Vinod KK, Singh UD, Rathore R, Prasanthi SK, Agrawal PK, Bhatt JC, Mohapatra T, Prabhu KV, Singh AK (2012). Incorporation of blast resistance into 'PRR78', an elite Basmati rice restorer line, through marker assisted backcross breeding. *Field Crop Res.* 128: 8-16.
- Singh A, Singh VK, Singh SP, Pandian RTP, Ellur RK, Singh D, Bhowmick PK, Gopala Krishnan S, Nagarajan M, Vinod KK, Singh UD, Prabhu KV, Sharma TR, Mohapatra T, Singh AK (2012). Molecular breeding for the development of multiple disease resistance in Basmati rice. AoB PLANTS Pls: 029.
- Singh NK, Shepherd KW, McIntosh RA (1990). Linkage mapping of genes for resistance to leaf, stem and stripe rusts and cusecalins on the short arm of rye chromosome 1 R. *Theor. Appl. Genet.* 80: 609-616.
- Singh P, Rao HS, Dubey L, Naik P, Prasanna BM (2010). Graphical genotyping of genomic

resources (QTL-NILs and RILs) and transcriptome profiling of maize genotypes in response to sorghum downy mildew (*Peronosclerospora sorghi*) in India. In: Proceedings of 10th Asian regional maize workshop. October 20-23, 2008, Makassar, Indonesia. CIMMYT, Mexico DF.

- Singh RP, Hodson DP, Huerta-Espino J, Jin Y, Njau P, Wanyera R (2008). Will stem rust destroy the world's wheat crop? *Adv. Agron.* 98: 271-309.
- Singh RP, Nelsonand JC, Sorrells ME (2000). Mapping *Yr*28 and other genes for resistance to stripe rust in wheat. *Crop Science* 40: 1148-1155.
- Singh RP, Nakamura K, Huerta-Espino J (2001). Leaf rust resistance genes in Japanese wheat cultivars. *Breeding Sci.* 51: 83-87.
- Singh S, Sidhu JS, Huang N, Vikal Y, Li Z, Brar DS, Dhaliwal HS, Khush GS (2001). Pyramiding three bacterial blight resistance genes (*xa*5, *xa*13, *Xa*21) using marker assisted selection into indica rice cultivar PR106. *Theor. Appl. Genet.* 102: 1011-1015.
- Singh S, Sidhu JS, Huang N, Vikal Y, Li Z, Brar DS, Dhaliwal HS, Khush GS (2001). Pyramiding three bacterial blight resistance genes (*xa5*, *xa*13 and *Xa*21) using marker-assisted selection into *indica* rice cultivar PR106. *Theor. Appl. Genet.* 102: 1011-1015.
- Singh VK, Singh A, Singh SP, Ellur RK, Choudhary V, Sarkel S, Singh D, Gopala-Krishnan S, Nagarajan M, Vinod KK, Singh UD, Rathore R, Prashanthi SK, Agrawal PK, Bhatt JC, Mohapatra T, Prabhu KV, Singh AK (2012). Incorporation of blast resistance into "PRR78", an elite Basmati rice restorer line, through marker assisted backcross breeding. *Field Crops Research* 128: 8-16.
- Smith PH, Hadfield J, Hart NJ, Koebner RMD, Boyd LA (2007). STS markers for the yellow rust resistance gene *Yr5* suggest a NBS-LRR-type resistance gene cluster. *Genome* 50: 259-265.
- Smith PH, Koebner RMD, Boyd LA (2002). The development of a STS marker linked to a yellow rust resistance derived from the wheat cultivar Moro. *Theor. Appl. Genet.* 104: 1278-1282.
- Spielmeyer W, Sharpand PJ, Lagudah ES (2003). Identification and validation of markers linked to broad-spectrum stem rust resistance gene *Sr2* in wheat (*Triticum aestivum* L.). *Crop Sci.* 43(1): 333-336.
- Steele KA, Price AH, Sashidhar HE, Witcombe JR (2006). Marker-assisted selection to

introgress rice QTLs controlling root traits into an Indian upland rice variety. *Theor. Appl. Genet.* 112: 208-221.

- Stoskopf NC, Tomes DT, Christie BR (1993). Plant breeding: theory and practice. San Francisco, CA; Oxford: Westview Press Inc.
- Suenaga K, Singh RP, Huerta-Espino J, William HM (2003). Microsatellite markers for genes *Lr*34/*Yr*18 and other quantitative trait loci for leaf rust and stripe rust resistance in bread wheat. *Phytopathology* 93: 881-890.
- Suh JP, Yang SJ, Jeung JU, Pamplona A, Kim JJ, Lee JH, Hong HC, Yang CI, Kim YG, Jena KK (2011). Development of elite breeding lines conferring Bph18 gene-derived resistance to brown planthopper (BPH) by markerassisted selection and genome-wide background analysis in japonica rice (Oryza sativa L.). *Field Crops Research* 120: 215-222.
- Sun Q, Wei Y, Ni Z, Xie C, Yang T (2002). Microsatellite marker for yellow rust resistance gene *Yr5* in wheat introgressed from spelt wheat. *Plant Breed.* 121: 539-541.
- Sundaram RM, Vishnupriya MR, Biradar SK, Laha GS, Reddy GA, ShobhaRani N, Sarma NP, Sonti RV (2008). Marker assisted introgression of bacterial blight resistance in Samba Mahsuri, an elite *indica* rice variety. *Euphytica* 160: 411-422.
- Takehisa H, Shimoda Y, Fukuta Y, Ueda T, Yano M, Yamaya T, Kameya T, Sato T (2004). Identification of quantitative trait loci for plant growth of rice in paddy field flooded with salt water. *Field Crops Res.* 89: 85-95.
- Takeuchi Y, Hayasaka H, Chiba B, Tanaka I, Shimano T, Yamagishi M, Nagano K, Sasaki T, Yano M (2001). Mapping quantitative trait loci controlling cool temperature tolerance at booting stage in temperate japonica rice. *Breed. Sci.* 51: 191-197.
- Tao Y, Liu Q, Wang H, Zhang Y, Huang X, Wang B, Lai J, Ye J, Liu B, Xu M (2013). Identification and fine-mapping of a QTL, *qMrdd1*, that confers recessive resistance to maize rough dwarf disease. *BMC Plant Biology* 13:145 DOI: 10.1186/1471-2229-13-145.
- Technow F, Burgerand A, Melchinger AE (2013). Genomic prediction of northern corn leaf blight resistance in maize with combined or separated training sets for heterotic groups. *G3: Genes Genomics Genetics* 3: 197-203.

- Thomson MJ, Ocampo Mde, Egdane J, Rahman MA, Sajise AG, Adorada DL, Tumimbang-Raiz E, Blumwald E, Seraj ZI, Singh RK, Gregorio GB, Ismail AM (2010). Characterizing the saltol quantitative trait locus for salinity tolerance in rice. *Rice* DOI 10.1007/s12284-010-9053-8.
- Thomson MJ, Ocampo MD, Egdane J, Katimbang M, Rahman MA, Singh RK, Gregorio GB, Ismail AM (2007). QTL mapping and marker-assisted backcrossing for improved salinity tolerance in rice. In: Proceedings of BioAsia 2007: 6<sup>th</sup> Asian Crop Science Association Conference and 2<sup>nd</sup> International Conference on Rice for the Future, Bangkok, Thailand, 5-9 November 2007, pp. 6-12.
- Toenniessen GH, O'Toole JC, DeVries J (2003). Advances in plant biotechnology and its adoption in developing countries. *Curr. Opin. Plant Biol.* 6: 191-198.
- Torada A, Koike M, Ikeguchiand S, Tsutsui I (2008). Mapping of a major locus controlling seed dormancy using backcrossed progenies in wheat (*Triticum aestivum* L.). *Genome* 51: 426-432.
- Trachsel S, Messmer R, Stamp P, Hund A (2009). Mapping of QTLs for lateral and axile root growth of tropical maize. *Theor. Appl. Genet.* 119: 1413-1424.
- Tsilo TJ, Kolmer JA, Anderson JA (2014). Molecular mapping and improvement of leaf rust resistance in wheat breeding lines. *Phytopathology* 104: 8.
- Tuberosa R, Salvi S, Giuliani S (2007). Genomewide approaches to investigate and improve maize response to drought. *Crop Sci.* 47: S120-S141.
- Tuberosa R, Salvi S, Sanguineti MC, Landi P, Caferriand MM, Conti S (2002). Mapping QTLs regulating morpho-physiological traits and yield: case studies, shortcomings and perspectives in drought-stressed maize. *Ann. Bot.* 89: 941-963.
- Van Egmond HP (2004). Natural toxins: risks, regulations and the analytical situation in Europe. *Anal Bioanal Chem.* 378: 1152-1160.
- Van Inghelandt D, Melchinger AE, Martinan JP, Stich B (2012). Genome-wide association mapping of flowering time and northern corn leaf blight (*Setosphaeria turcica*) resistance in a vast commercial maize germplasm set. *BMC Plant Biol.* 12: 56.
- Venuprasad R, Dalid Del Valle COM, Zhao D, Espiritu M, Sta Cruz MT, Amante M,

Venuprasad R, Shashidhar HE, Hittalmani S, Hemamalini GS (2002). Tagging quantitative trait loci associated with grain yield and root morphological traits in rice (*Oryza sativa* L.) under contrasting moisture regimes. *Euphytica* 128: 293-300.

- Venuprasad R, Bool ME, Quiatchon L, Sta Cruz MT, Amante M, Atlin GN (2011). A large-effect QTL for rice grain yield under upland drought stress on chromosome 1. *Mol. Breed.* DOI 10.1007/s11032-011-9642-2.
- Verma V, Foulkes MJ, Worland AJ, Sylvester-Bradley R, Caligari PDS, Snape JW (2004). Mapping quantitative trait loci for flag leaf senescence as a yield determinant in winter wheat under optimal and drought-stressed environments. *Euphytica* 135(3): 255-263.
- Vijayalakshmi K, Fritz AK, Paulsen GM, Bai G, Pandravada S, Gill BS (2010). Modeling and mapping QTL for senescence-related traits in winter wheat under high temperature. *Mol. Breed.* 26: 163-175.
- Vikram P, Swamy BPM, Dixit S, Cruz MTS, Ahmed HU, Singh AK, Kumar A (2011). q*DTY1.1*, a major QTL for rice grain yield under reproductive-stage drought stress with a consistent effect in multiple elite genetic backgrounds. *BMC Genetics* 12: 89.
- Visscher PM, Haley CS, Thompson R (1996). Marker assisted introgression in backcross breeding programs. *Genetics* 144: 1923-1932.
- Wahid A, Gelani S, Ashraf M, Foolad MR (2007). Heat tolerance in plants: an overview. *Environ. Exp. Bot.* 61: 199-223.
- Wamishe YA, Milus EA (2004). Genes for adult plant resistance to leaf rust in soft red winter wheat. *Plant Dis.* 88: 1107-1114.
- Wan JL, Zhai H, Wan JM (2005). Mapping for QTLs for ferrous iron toxicity tolerance in rice (*Oryza sativa* L.). Acta Genet. Sin. 32: 1156-1166.
- Wani SH, Singh NB, Haribhushan A, Mir JL (2013). Compatile solute engineering in plants for abiotic stress tolerance- role of glycine betaine. *Current genomics* 14(3): 157.
- Wanyera R, Kinyua MG, Jin Y, Singh RP (2006). The spread of stem rust caused by *Puccinia* graminis f. sp. tritici, with virulence on Sr31 in wheat in Eastern Africa. *Plant Disease* 90: 113.
- Whitford R, Gilbert M, Langridge P (2010). Biotechnology in agriculture. In: M.P. Reynolds, ed., Climate change and crop production, *CABI Series in Climate Change* 1: 219-244, *CABI*, UK.

- Willcox MC, Khairallah MM, Bergvinson D, Crossa J, Deutsch JA, Edmeades GO, Gonzalez-deleon D, Jiang C, Jewell DC, Mihm JA, Williams WP, Hoisington D (2002).
  Selection for resistance to southwestern corn borer using marker-assisted and conventional backcrossing. *Crop Sci.* 42: 1516-1528.
- Wisser RJ, Sun Q, Hulbert SH, Kresovich S, Nelson RJ (2005). Identification and characterization of regions of the rice genome associated with broad-spectrum, quantitative disease resistance. *Genetics* 169: 2277-2293.
- Wissuwa M, Wehner J, Ae N, Yano M (2002). Substitution mapping of *Pup1*: a major QTL increasing phosphorous uptake of rice from a phosphorous-deficient soil. *Theor. Appl. Genet.* 105: 890-897.
- Wissuwa M, Yano M, Ae N (1998). Mapping of QTLs for phosphorus-deficiency tolerance in rice (*Oryza sativa* L.). *Theor. Appl. Genet.* 97: 777-783.
- Wong CK, Bernardo R (2008). Genome wide selection in oil palm: increasing selection gain per unit time and cost with small populations. *Theor. Appl. Genet.* 116: 815-824.
- Wu JL, Sinha PK, Variar M, Zheng KL, Leach JE, Courtois B, Leung H (2004). Association between molecular markers and blast resistance in an advanced backcross population of rice. *Theor. Appl. Genet.* 108: 1024-1032.
- Xiao YN, Li XH, George ML (2005). Quantitative trait loci analysis of drought tolerance and yield in maize in China. *Plant Mol. Biol. Reporter* 23: 155-165.
- Xu JL, Lefftte HR, Gao YM, Fu BY, Torres R, Li ZK (2005). QTLs for drought escape and tolerance identified in a set of random introgression lines of rice. *Theor. Appl. Genet.* 111: 1642-1650.
- Xu K, Xia X, Fukao T, Canlas P, Maghirang-Rodriguez R, Heuer S, Ismail AI, Bailey-Serres J, Ronald PC, Mackill DJ (2006). Sub1A is an ethylene response factor-like gene that confers submergence tolerance to rice. Nature 442: 705-708.
- Xu K, Xu X, Ronald PC, Mackill DJ (2000). A highresolution linkage map in the vicinity of the rice submergence tolerance locus *Sub1*. *Mol. Gen. Genet.* 263: 681-689.
- Xu LM, Zhou L, Zeng YW, Wang FM, Zhang HL, Shen SQ, Li ZC (2008). Identification and mapping of quantitative trait loci for cold

tolerance at the booting stage in a japonica rice near-isogenic line. *Plant Sci.* 174: 340-347.

- Xu Y, Crouch JH (2008). Marker-assisted selection in plant breeding: from publications to practice. *Crop Sci.* 48: 391-407.
- Xu Y, Xie C, Wan J, He Z, Prasanna BM (2013). Marker-assisted selection in cereals: platforms, strategies and examples. In: P.K. Gupta and R.K. Varshney, eds., Cereal genomics II, Springer, Dordrecht, pp. 375-411.
- Xue S, Xu F, Tang M, Zhou Y, Li G, An X, Lin F, Xu H, Jia H, Zhang L, Kong Z, Ma Z (2011). Precise mapping *Fhb5*, a major QTL conditioning resistance to Fusarium infection in bread wheat (*Triticum aestivum* L.). *Theor. Appl. Genet.* 123: 1055-1063.
- Yan GP, Chen XM, Line RF, Wellings CR (2003). Resistance gene-analog polymorphism markers co-segregating with the *Yr5* gene for resistance to wheat stripe rust. *Theor. Appl. Genet.* 106: 636-643.
- Yang EN, Rosewarne GM, Herrera-Foessel SA, Huerta-Espino J, Tang ZX, Sun CF, Ren ZL, Singh RP (2013). QTL analysis of the spring wheat "Chapio" identifies stable stripe rust resistance despite inter-continental genotype × environment interactions. *Theor. Appl. Genet.* 126: 1721-1732.
- Yang J, Sears RG, Gill BS, Paulsen GM (2002a). Genotypic differences in utilization of assimilate sources during maturation of wheat under chronic heat and heat shock stresses. *Euphytica* 125: 179-188.
- Yao ZJ, Lin RM, Xu SC, Li ZF, Wan AM, Ma ZY (2006). The molecular tagging of yellow rust resistance gene *Yr*7 in wheat transferred from differential host Lee using microsatellite markers. *Scientia Agricultura Sinica* 39: 1148-1152.
- Yeo AR, Yeo ME, Flowers SA, Flowers TJ (1990). Screening of rice (*Oryza sativa* L.) genotypes for physiological characters contributing to salinity resistance and their relationship to overall performance. *Theor. Appl. Genet.* 79(3): 377-384.
- Yildirim A, Karadag Y, Sakin MA, Gokmen S, Kandemir N, Akkaya MS (2004). Transfer of stripe rust resistance gene *Yr*26 to Turkish wheats using microsatellite markers. *Cereal Res. Comm.* 32: 25-30.
- Yu LX, Morgounov A, Wanyera R, Keser M, Singh SK, Sorrells M (2012). Identification of Ug99 stem rust resistance loci in winter wheat germplasm using genome-wide

association analysis. *Theor. Appl. Genet.* 125: 749-758.

- Yue B, Xue WY, Xiong LZ, Yu XQ, Luo LJ, Cui KH, Jin DM, Xing YZ, Zhang QF (2006). Genetic basis of drought resistance at reproductive stage in rice: Separation of drought tolerance from drought avoidance. *Genetics* 172: 1213-1228.
- Zaidi PH, Maniselvan P, Srivastava A, Yadav P, Singh RP (2010). Genetic analysis of waterlogging tolerance in tropical maize (*Zea Mays* L.). *Maydica* 55: 17-26.
- Zakari A, McIntosh RA, Hovmoller MS, Wellings CR, Shariflou MR, Hayden M (2003). Recombination of *Yr*15 and *Yr*24 in chromosome - IBS. In: N.E. Pogna, M. Romano, E.A. Pogna and G. Galterio, eds., Proceedings of the 10<sup>th</sup> International Wheat Genetics Symposium. Paestum, Italy,

Volume 1. Institute Sperimentale per la Cerealicoltura, Rome, pp. 417-420.

- Zeng Y, Yang S, Cui H, Yang X, Xu L, Du J, Pu X, Li Z, Cheng Z, Huang X (2009). QTLs of cold tolerance-related traits at the booting stage for NIL–RILs in rice revealed by SSR. *Genes Genomics* 31: 143-154.
- Zhang P, McIntosh RA, Hoxha S, Dong C (2009). Wheat stripe rust resistance genes *Yr5* and *Yr7* are allelic. *Theor. Appl. Genet.* 120: 25-29.
- Zhang Q (2007). Strategies for developing green super rice. *Proc. Natl. Acad. Sci. USA* 104: 16402-16409.
- Zhong S, Dekkers JCM, Fernando RL, Jannink JL (2009). Factors affecting accuracy from genomic selection in populations derived from multiple inbred lines: a barley case study. *Genetics* 182: 355-364.