

AMMI Biplot Analysis for Stability of Grain Yield in Hybrid Rice (*Oryza sativa* L.)

Anowara Akter^{1*}, Jamil Hassan M¹, Umma Kulsum M¹, Islam MR¹, Kamal Hossain¹ and Mamunur Rahman M²

¹Plant Breeding Division, Bangladesh Rice Research Institute, Bangladesh

²Senior Scientific Officer, Farm Management Division, Bangladesh

Abstract

Genotype x environment interaction and stability performance were investigated on grain yield with 12 rice genotypes in five environments. The ANOVA for grain yield revealed highly significant ($P < 0.01$) for genotypes, environments and their interactions. The significant interaction indicated that the genotypes respond differently across the different environments. The mean grain yield value of genotypes averaged over environments indicated that BRRI 10A/ BRRI 10R (G3) had the highest (5.99 tha^{-1}) and BRRI dhan39 (G12) the lowest yield (3.19 tha^{-1}), respectively. In AMMI analysis, AMMI 1 biplot showed the hybrids BRRI 1A/ BRRI 827R (G1), IR58025A/ BRRI 10R(G2), BRRI 10A/BRRI 10R(G3) and BRRI hybrid dhan1(G4) have higher average mean yields with high main (additive) effects with positive IPCA1 score, but the hybrid BRRI 10A/BRRI 10R(G3) being the overall best. Hence, the genotype G3 would be considered more adapted to a wide range of environments than the rest of genotypes. Environments, such as Gazipur (E1) and Jessore (E5) could be regarded as a more stable site for high yielding hybrid rice improvement than other location for grain yield due to IPCA score near zero which had no interaction effect. In AMMI 2 biplot, Comilla (E2) and Rangpur (E4) are the most discriminating environments, while BRRI 1A/ BRRI 827R (G1) and Heera 99-5 (G9) are the most responsive genotypes.

Keywords: AMMI analysis; Stability; GEI structure; Hybrid rice

Introduction

Rice has a special significant position as a source of food providing over 75% of Asian's staple food and more than three billion of world population's meal which represents 50 to 80% of their daily calorie intake [1,2]. This population will increase to over 4.6 billion by 2050 [3] which will demand more than 50% of rice needs to be produced what is produced present to cope with the growing population [4,5]. Yields of improved inbred rice varieties in favorable conditions have reached to a plateau or even subsequently declined in many countries including Bangladesh. It is recommended that a large number of high yielding stable hybrids with high adaption capability to diverse environments are required to accomplish specific socio-economic and agricultural needs. Hence, we need new hybrid rice because it gives 15-30% yield advantage over inbred rice. Moreover, hybrid rice has also shown better performance under adverse conditions like drought and saline conditions. If we can develop high yielding stable hybrid rice adopted on diverse environments, we can find most diverse stable heterotic hybrid combinations to increase food production for increasing world population.

Yield is a complex character which is dependent on a number of other characters and is highly influenced by many genetic factors as well as environmental fluctuations. On the other hand, the G x E interaction is an important aspect of both plant breeding program and the introduction of new crop cultivars [6-8]. The AMMI model is a hybrid model involving both additive and multiplicative components of two way data structure which enabled a breeder to get precise prediction on genotypic potentiality and environmental influences on it. AMMI uses ordinary ANOVA to analyze the main effects (additive part) and principal component analysis (PCA) to analyze the non-additive residual left over by the ANOVA [9]. The effectiveness of AMMI procedure has been clearly demonstrated by various authors using multilocation data in soybean [10], maize [11], Wheat [12-14], pearl millet [15], Okra [16], Field pea [17] and rice [18,19]. The main objectives of the present study are to identify more high yielding stable

promising hybrids and to determine the areas where rice hybrids would be adapted by AMMI model. Therefore, using the AMMI analysis with biplot facility, yield data were analyzed to determine the nature and magnitude of G x E interaction effects on grain yield in diverse environments.

Materials and Methods

The experiments were conducted at five districts namely Gazipur (E1), Comilla (E2), Barisal (E3), Rangpur (E4) and Jessore (E5) representing five different agro-ecological zones (AEZ) of Bangladesh. Twelve genotypes consisting of 3 advanced lines (BRRI 1A/ BRRI 827R (G1), IR58025A/ BRRI 10R (G2) and BRRI 10A/ BRRI 10R (G3)), 6 released hybrids (BRRI hybrid dhan1(G4), Tea (G5), Mayna (G6), Richer (G7), Heera-2 (G8) and Heeta 99-5 (G9)), and 3 inbred check varieties (BRRI dhan31 (G10), BRRI dhan33 (G11) and BRRI dhan39 (G12)) were used as experimental materials. The experiments were carried out in a randomized complete block design (RCBD), with three replications. Twenty-one-days old seedlings were transplanted in 20 square meter plot using single seedling per hill at a spacing of 20 cm x 15 cm. Fertilizers were applied @ 150:100:70:60:10 kg/ha Urea, TSP, MP, gypsum and ZnSO₄, respectively. Standard agronomic practices were followed and plant protection measures were taken as required

***Corresponding authors:** Mamunur Rahman M, Senior Scientific Officer, Farm Management Division, Bangladesh, Tel: +8801717233159; E-mail: rahmanmamunur@gmail.com

Anowara Akter, Plant Breeding Division, Bangladesh Rice Research Institute, Bangladesh, E-mail: anowaraa@yahoo.com

Received May 20, 2014; Accepted June 27, 2014; Published June 30, 2014

Citation: Akter A, Jamil Hassan M, Umma Kulsum M, Islam MR, Hossain K, et al. (2014) AMMI Biplot Analysis for Stability of Grain Yield in Hybrid Rice (*Oryza sativa* L.). J Rice Res 2: 126. doi: [10.4172/jrr.1000126](https://doi.org/10.4172/jrr.1000126)

Copyright: © 2014 Akter A, et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

following the recommendation of BRR1 [20]. Two border rows were used to minimize the border effects. The grain yield (tha^{-1}) data were collected at 14% moisture level. Data were collected followed by standard method as described by [21]. The grain yield data for twelve (12) genotypes in five (5) environments were subjected to AMMI analysis of variance using statistical analysis package software Cropstat version 6.1 (Cropstat, Tutorial Manual Part 2, Revised April, 2008).

Results and Discussion

AMMI analysis of variance

The AMMI analysis of variance for grain yield (tha^{-1}) of 12 genotypes tested in five environments showed that the main effects of G and E accounted for 67.11% and 18.46% variation, respectively, and G x E interaction effects represent 13.11% of the total variation for grain yield (Table 1). The analysis revealed that variances due to environments, and G x E interactions are significant ($P < 0.01$). The large sum of squares for genotypes indicated that the genotypes were diverse, with large differences among genotypic means causing most of the variation in grain yield, which is in harmony with the findings of [22,23]. The presence of genotype-environment interaction (GEI) was clearly demonstrated by the AMMI model, when the interaction was partitioned among the first three interaction principal component axis (IPCA) as they were significant in postdictive assessment. The

IPCA1 explained 9.68% of the interaction sum of square in 14% of the interaction degree of freedom (DF). Similarly, the second and third principal component axis (IPCA 2-3) explained a further 2.02% and 1.23% of the GEI sum of squares, respectively (Table 1). This implied that the interaction of the rice genotypes with five environments was predicted by the first three components of genotypes and environments, which is in agreement with the recommendation of Sivapalan et al. [24]. However, this contradicted the findings of Gauch and Zobel [25] which recommended that the most accurate model for AMMI can be predicted using the first two IPCAs. These results indicate that the number of terms to be included in an AMMI model cannot be specified a priori without first trying AMMI predictive assessment [26]. In general, factors like type of crop, diversity of the germplasm and range of environmental conditions will affect the degree of complexity of the best predictive model [11].

Stability analysis by AMMI model

Biplot analysis is possibly the most powerful interpretive tool for AMMI models. There are two basic AMMI biplots, the AMMI 1 biplot where the main effects (genotype mean and environment mean) and IPCA1 scores for both genotypes and environments are plotted against each other. On the other hand, the second biplot is AMMI 2 biplot where scores for IPCA1 and IPCA2 are plotted (Table 2). The mean grain yield value of genotypes averaged over environments indicated

Source of Variation	d.f	SS	MS	Explained SS (%)
Genotypes (G)	11	40.498	3.682**	67.11
Environments (E)	4	11.142	2.785**	18.46
G x E Interaction (GEI)	44	7.908	0.179**	13.11
IPCA1	14	5.842	0.417**	9.68
IPCA2	12	1.220	0.102**	2.02
IPCA3	10	0.741	0.074**	1.23
Error	120	0.803	0.007	
Total	179	60.353		

** Significant at $P < 0.01$

Table 1: Additive main effects and multiplicative interaction (AMMI) analysis of variance for grain yield (tha^{-1}) of 12 rice genotypes across 5 environments.

Genotypes/Environments	Gazipur (E1)	Comilla (E2)	Barisal (E3)	Rangpur (E4)	Jessore (E5)	Mean	Index	IPCA1	IPCA2
BRR1 1A/ BRR1 827R (G1)	5.10	5.04	4.41	3.37	5.13	4.61	0.57	0.852	0.421
IR58025A/ BRR1 10R (G2)	5.78	5.11	4.52	4.31	5.12	4.97	0.92	0.502	0.147
BRR1 10A/ BRR1 10R (G3)	6.47	6.05	5.86	5.67	5.41	5.99	1.95	0.293	0.254
BRR1 hybrid dhan1 (G4)	5.83	4.66	4.26	4.19	5.19	4.83	0.78	0.356	0.001
Tea (G5)	4.40	3.19	2.99	3.58	3.22	3.48	-0.56	-0.008	0.670
Mayna (G6)	4.23	2.37	3.11	3.67	3.56	3.39	-0.66	-0.461	0.155
Richer (G7)	4.43	2.45	3.42	3.67	4.19	3.63	-0.41	-0.449	-0.294
Heera-2 (G8)	4.33	3.03	3.66	3.88	3.86	3.75	-0.29	-0.273	0.103
Heeta 99-5 (G9)	4.17	2.47	4.00	4.03	4.32	3.80	-0.25	-0.647	-0.460
BRR1 dhan31 (G10)	4.34	3.35	3.11	2.76	4.02	3.52	-0.53	0.391	-0.239
BRR1 dhan33 (G11)	4.24	2.62	3.03	3.34	3.65	3.38	-0.66	-0.193	0.049
BRR1 dhan39 (G12)	3.80	2.32	3.08	3.40	3.37	3.19	-0.86	-0.358	0.033
Mean	4.76	3.56	3.79	3.82	4.30				
Index	0.72	-0.49	-0.26	-0.22	0.25				
IPCA 1	0.040	1.179	-0.234	-0.985	-0.001				
IPCA 2	0.278	0.328	-0.313	0.478	-0.771	GM=4.05			
SE	0.08	0.09	0.06	0.10	0.07				
CV(%)	3	4	3	5	3				
5% LSD	0.24	0.25	0.18	0.30	0.21				

Table 2: Stability parameters for grain yield (tha^{-1}) of 12 rice genotypes in 5 environments.

that the genotypes G3 and G12 had the highest (5.99 tha^{-1}) and the lowest (3.19 tha^{-1}) yield, respectively. Different genotypes showed inconsistent performance across all environments. The environments mean grain yield ranged from 4.76 tha^{-1} for E1 to 3.56 tha^{-1} for E2 and averaged grain yield over environments and genotypes is 4.05 tha^{-1} . On the basis of environmental index value in terms of negative and positive, E2, E3 and E4 are poor, and E1 and E5 are rich environment. Within the genotypes G1, G2, G3 and G4 have higher average yields and these genotypes adapted to favorable environments, while genotypes G5 to G12 adapted to poor environments.

AMMI 1 biplot display

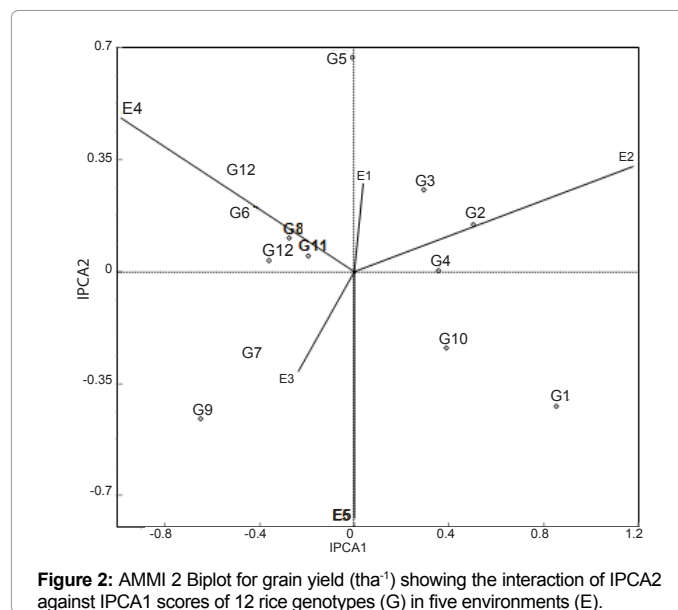
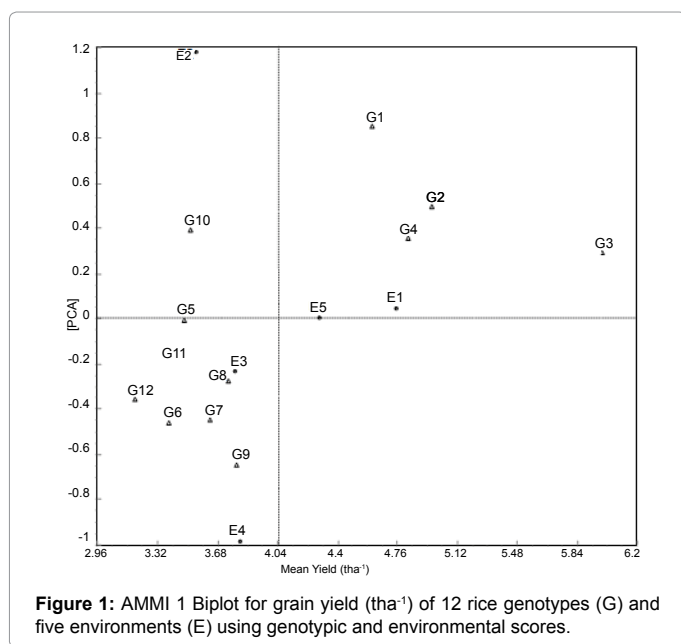
Biplots are graphs where aspects of both genotypes and environments are plotted on the same axes so that inter relationships can be visualized. In the AMMI 1 biplot, the usual interpretation of biplot is that the displacements along the abscissa indicate differences in main (additive) effects, whereas displacements along the ordinate indicate differences in interaction effects. Genotypes that group together have similar adaptation while environments which group together influences the genotypes in the same way [27]. The best adapted genotype can plot far from the environment. If a genotype or an environment has a IPCA1 score of nearly zero, it has small interaction effects and considered as stable. When a genotype and environment have the same sign on the PCA axis, their interaction is positive and if different, their interaction is negative. The AMMI 1 biplot expected yield clearly indicated for any genotype and environment combination can be calculated from Figure 1 following standard procedures suggested by Zobel et al. [10].

The AMMI 1 biplot gave a model fit 96.5%. This result is in agreement with the findings of Naveed et al. [28] and Gauch and Zobel [25]. Genotypes and environments on the same parallel line, relative to the ordinate have similar yields and a genotype or environment on the right side of the mid point of this axis has higher yields than those of left hand side. Consequently, among the hybrids, (G1), (G2), (G3) and (G4) were generally exhibited high yield with high main (additive) effects showing positive IPCA1 score, but the hybrid (G3) being the over all best. Hence, the hybrid (G3) was identified as specially adapted

culture to the mentioned environments and these environments were considered as the wide range suitable environments for this genotype. Similar outcomes have reported by Das et al. [29], and Kulsum et al. [30]. Since, the environments E1 and E5 had positive IPCA1 score near zero and hence had small interaction effects indicating that all the genotypes performed well in these locations. Adugna et al. [31] and Anandan et al. [32] reported similar pattern of interactions. Thus these two locations were considered as the favorable environments for the genotypes G1, G2, G3 and G4. The genotype G5 showed IPCA1 score close to zero, indicating that the variety was stable and less influenced by the environments [33]. Other genotypes showed below average yield. Similarly, the genotype G10 was moderately stable across environments (low positive IPCA1 score) and below average yield. On the other hand, G8, G11 and environment, E3 had below average yield with negative IPCA1 score near zero indicating that these varieties were less influenced by the environments. Likewise, the environment E3, were found favorable environment for the genotype G11 and G8. Finally, The AMMI 1 biplot statistical model has been used to diagnose the G x E interaction pattern of grain yield of hybrid rice. The hybrids (G1), (G2), (G3) and (G4) were hardly affected by the G x E interaction and thus will perform well across a wide range of environments. Locations, such as E1 and E5 could be regarded as a good selection site for rice hybrid improvement due to stable yields.

AMMI 2 biplot display

In AMMI 2 biplot, (Figure 2) the environmental scores are joined to the origin by side lines. Sites with short spokes do not exert strong interactive forces. Those with long spokes exert strong interaction. An example of this is shown in Figure 2 where the points representing the environments E1, E2, E3, E4 and E5 are connected to the origin. The environments E1 and E3 had short spokes and they do not exert strong interactive forces. The genotypes occurring close together on the plot will tend to have similar yields in all environments, while genotypes far apart may either differ in mean yield or show a different pattern of response over the environments. Hence, the genotypes near the origin are not sensitive to environmental interaction and those distant from the origins are sensitive and have large interaction. In the present study,



G1 and G9 had more responsive since they were away from the origin whereas the genotypes G8, G11, G12 and G4 were close to the origin and hence they were non sensitive to environmental interactive forces.

Conclusions

Crop yield is a complex trait that is influenced by a number of component characters along with the environment directly or indirectly. If we could develop high yielding stable hybrid rice for diverse environments, we could offer most diverse stable heterotic hybrids for the rice growers. AMMI statistical model could be a great tool to select the most suitable and stable high yielding hybrids for specific as well as for diverse environments. In the present study, AMMI model has shown that the largest proportion of the total variation in grain yield was attributed to environments. Here most of the genotypes showed environment specificity. The mean grain yield value of genotypes averaged over environments indicated that G3 had the highest (5.99 tha^{-1}) and G12 the lowest yield (3.19 tha^{-1}), respectively. It is noted that the variety G3 showed higher grain yield than all other varieties over all the environments. The genotypes (G1), (G2), (G3) and (G4) were hardly affected by the G x E interaction and thus would perform well across a wide range of environments.

References

1. Khush GS (2005) What it will take to feed 5.0 billion rice consumers in 2030. *Plant Mol Biol* 59: 1-6.
2. Amirjani MR (2011) Effect of salinity stress on growth, sugar content, pigments and enzyme activity of rice. *International Journal of Botany* 7: 73-81.
3. Honarnejad RS, Abdollahi MS, Mohammad-Salehi, Dorosti H (2000) Consideration of adaptability and stability of grain yield of progressive rice (*Oryza sativa* L.) lines. *Research in Agricultural Science* 1: 1-9.
4. Ashikari M, Sakakibara H, Lin S, Yamamoto T, Takashi T, et al. (2005) Cytokinin oxidase regulates rice grain production. *Science* 309: 741-745.
5. Srividya A, Vemireddy LR, Hariprasad AS, Jayaprada M, Sridhar S (2010) Identification and mapping of landrace derived QTL associated with yield and its components in rice under different nitrogen levels and environments. *International Journal of Plant Breeding and Genetics* 4: 210-227.
6. McLaren CG, Chaudhary C, (1994) Use of additive main effects and multiplicative interaction models to analyse multilocation rice variety trials. Paper presented at the FCSSP Conference, Puerto Princesa, Palawan, Philippines.
7. Prasad KV, Singh RL (1990) Stability analysis of yield and yield components and construction of selection indices of direct seeded rice in frost season. Annual Review conference Proceeding. 20-23 October 1992. National Agril. Res. Inst. Caribbean Agricultural Research and development Institute, Guyana, pp. 63-71.
8. Freeman GH (1985) The analysis and interpretation of interaction. *Journal of Applied Statistics*. 12: 3-10.
9. Gauch HG (1993) Matmodel version 2.0. AMMI and related analysis for two-way data matrices. Micro computer power, Ithaca, New York, USA.
10. Zobel RW, Wright MJ, Gauch HG (1988) Statistical analysis of a yield trial. *Agronomy Journal*. 80: 388-393.
11. Crossa J, Gauch HGJ, Zobel RW (1990) Additive main effects and multiplicative interaction analysis of two international maize cultivar trials. *Crop Science*. 30: 493-500.
12. Crossa J, Fox PN, Pfeiffer WH, Rajaram S, Gauch HG Jr (1991) AMMI adjustment for statistical analysis of an international wheat yield trial. *Theor Appl Genet* 81: 27-37.
13. Yan W, Hunt LA (2001) Interpretation of genotype x environment interaction for winter wheat yield in Ontario. *Crop Science* 41: 19-25.
14. Tarakanovas T, Rugas V (2006) Additive main effect and multiplicative interaction analysis of grain yield of wheat varieties in Lithuania. *Agronomy*

Research 4: 91-98.

15. Shinde GC, Bhingarde MT, Mehetre SS (2002) AMMI analysis for stability of grain yield of pearl millet (*Pennisetum typhoides* L.) hybrids. *International Journal of Genetics* 62: 215-217.
16. Ariyo OJ, Ayo-Vaughan MA (2000) Analysis of genotype x environment interaction of okra (*Abelmoschus esculentus* (L) Moench). *Journal of Genetics and Breeding* 54: 33-40.
17. Taye G, Getachew T, Bejiga G (2000) AMMI adjustment for yield estimate and classifications of genotypes and environments in field pea (*Pisum sativum* L.). *Journal of Genetics and Breeding* 54: 183-191.
18. Das S, Misra RC, Patnaik MC (2009) GxE interaction of mid-late rice genotypes in LR and AMMI model and evaluation of adaptability and yield stability. *Environment and Ecology* 27: 529-535.
19. Nassir AL (2013) Genotype x Environment analysis of some yield components of upland rice (*Oryza sativa* L.) under two ecologies in Nigeria. *International Journal of Plant Breeding and Genetics* 7: 105-114.
20. BRRI (2010) Adhunik dhaner chash. (15th edn), Bangladesh Rice Research Institute, Gazipur-1700, Bangladesh. p. 20-50.
21. Yoshida S, Forno DA, Cock JH, Gomez KA (1976) Laboratory manual for physiological studies of rice. (3rd edn), International Rice Research Institute, Los Banos, Philippines.
22. Misra RC, Das S, Patnaik MC (2009) AMMI Model Analysis of Stability and Adaptability of Late Duration Finger Millet (*Eleusine coracana*) Genotypes. *World Applied Sciences Journal* 6: 1650-1654.
23. Fentie M Assefa A, Belete K (2013) Ammi Analysis of Yield Performance and Stability of Finger Millet Genotypes Across Different Environments. *World Journal of Agricultural Sciences* 9: 231-237.
24. Sivapalan S, Brien LO, Ferrana GO, Hollamby GL, Barelay I, et al. (2000) An adaption analysis of Australian and CIMMYT/ ICARDA wheat germplasm in Australian production environments. *Australian Journal of Agriculture Research* 51: 903-915.
25. Gauch HG, Zobel RW (1996) AMMI analysis of yield trials. In M.S. Kang & H.G. Gauch. (eds.). *Genotype-by-environment interaction*, pp: 85-122.
26. Kaya Y, Palta C, Taner S (2002) Additive main effects and multiplicative interactions analysis of yield performance in bread wheat genotypes across environments. *Turuk Journal of Agriculture* 26: 275-279.
27. Kempton RA (1984) The use of biplots in interpreting variety by environment interactions. *Journal of Agricultural Science* 103: 123-135.
28. Nadeem NM, Islam N (2007) AMMI analysis of some upland cotton genotypes for yield stability in different milieus. *World Journal of Agricultural Sciences* 3: 39-44.
29. Das S, Misra RC, Patnaik MC, Das SR (2010) GxE interaction, adaptability and yield stability of mid-early rice genotypes. *Indian Journal of Agricultural Research*. 44: 104-111.
30. Kulsum MU, M Jamil Hasan, Anowara Akter, Hafizar Rahman, Priyalal Biswas (2013) Genotype-environment interaction and stability analysis in hybrid rice: an application of additive main effects and multiplicative interaction. *Bangladesh J Bot* 42: 73-81.
31. Adujna A (2007) Assessment of Yield Stability in Sorghum. *African Crop Science Journal*. 15: 83-92.
32. Anandan A, Eswaran R, Sabesan T, Prakash M (2009) Additive main effects and multiplicative interactions analysis of yield performances in rice genotypes under coastal saline environments. *Advances in Biological Research* 3: 43-48.
33. Yau SK (1995) Regression and AMMI analyses of genotype x environment interactions: An empirical comparison. *Agronomy Journal* 87: 121-126.

Citation: Akter A, Jamil Hassan M, Umma Kulsum M, Islam MR, Hossain K, et al. (2014) AMMI Biplot Analysis for Stability of Grain Yield in Hybrid Rice (*Oryza sativa* L.). J Rice Res 2: 126. doi: [10.4172/jrr.1000126](https://doi.org/10.4172/jrr.1000126)