

# Package ‘baystability’

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**Type** Package

**Title** Bayesian Stability Analysis of Genotype by Environment Interaction (GEI)

**Version** 0.1.0

**Maintainer** Muhammad Yaseen <myaseen208@gmail.com>

**Description** Performs general Bayesian estimation method of linear–bilinear models for genotype  $\times$  environment interaction. The method is explained in Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) (<doi:10.1007/s13253-011-0063-9>).

**Depends** R ( $\geq$  3.1)

**Imports** dplyr, ggplot2, ggfortify, lme4, magrittr, MASS, matrixStats, reshape2, rstiefel, rlang, scales, stats, tibble, tidyverse

**License** GPL-2

**Encoding** UTF-8

**LazyData** true

**RoxygenNote** 6.0.1

**NeedsCompilation** no

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**bayes\_ammi**                    *Bayesian Estimation of Genotype by Environment Interaction Model*

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## Description

Bayesian estimation method of linear–bilinear models for Genotype by Environment Interaction Model

## Usage

```
## Default S3 method:
bayes_ammi(.data, .y, .gen, .env, .rep, .nIter)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor
.rep	Replication Factor
.nIter	Number of Iterations

## Value

Genotype by Environment Interaction Model

## Author(s)

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2. Diego Jarquin (<diego.jarquin@gmail.com>)
3. Sergio Perez-Elizalde (<sergiop@colpos.mx>)
4. Juan Burgueño (<j.burgueno@cgiar.org>)
5. Jose Crossa (<j.crossa@cgiar.org>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```

data(cultivo2008)
fm1 <-
  ge_ammi(
    .data = cultivo2008
    , .y     = y
    , .gen   = entry
    , .env   = site
    , .rep   = rep
  )

r0 <- fm1$g
c0 <- fm1$e
n0 <- fm1$Rep
k0 <- fm1$k

mu0      <- fm1$mu
sigma20  <- fm1$sigma2
tau0     <- fm1$tau
tao0     <- fm1$tao
delta0   <- fm1$delta
lambdas0 <- fm1$lambdas
alphas0  <- fm1$alphas
gammas0  <- fm1$gammas

ge_means0 <- fm1$ge_means$ge_means

data(cultivo2008)

fm2 <-
  ge_ammi(
    .data = cultivo2009
    , .y     = y
    , .gen   = entry
    , .env   = site
    , .rep   = rep
  )

k        <- fm2$k
alphas  <- fm2$alphas
gammas  <- fm2$gammas

alphas1 <- tibble::as_tibble(fm2$alphas)
gammas1 <- tibble::as_tibble(fm2$gammas)

```

```

# Biplots OLS
library(ggplot2)
BiplotOLS1 <-
  ggplot(data = alphas1, mapping = aes(x = V1, y = V2)) +
  geom_point() +
  geom_hline(yintercept = 0) +
  geom_vline(xintercept = 0) +
  geom_text(aes(label = 1:nrow(alphas1)), vjust = "inward", hjust = "inward") +
  scale_x_continuous(
    limits = c(-max(abs(c(range(alphas1[, 1:2])))),
              , max(abs(c(range(alphas1[, 1:2])))))) +
  scale_y_continuous(
    limits = c(-max(abs(c(range(alphas1[, 1:2])))),
              , max(abs(c(range(alphas1[, 1:2])))))) +
  labs(title = "OLS", x = expression(u[1]), y = expression(u[2])) +
  theme_bw() +
  theme(plot.title = element_text(hjust = 0.5))
print(BiplotOLS1)

BiplotOLS2 <-
  ggplot(data = gammas1, mapping = aes(x = V1, y = V2)) +
  geom_point() +
  geom_hline(yintercept = 0) +
  geom_vline(xintercept = 0) +
  geom_text(aes(label = 1:nrow(gammas1)), vjust = "inward", hjust = "inward") +
  scale_x_continuous(
    limits = c(-max(abs(c(range(gammas1[, 1:2])))),
              , max(abs(c(range(gammas1[, 1:2])))))) +
  scale_y_continuous(
    limits = c(-max(abs(c(range(gammas1[, 1:2])))),
              , max(abs(c(range(gammas1[, 1:2])))))) +
  labs(title = "OLS", x = expression(v[1]), y = expression(v[2])) +
  theme_bw() +
  theme(plot.title = element_text(hjust = 0.5))
print(BiplotOLS2)

BiplotOLS3 <-
  ggplot(data = alphas1, mapping = aes(x = V1, y = V2)) +
  geom_point() +
  geom_hline(yintercept = 0) +
  geom_vline(xintercept = 0) +
  geom_text(aes(label = 1:nrow(alphas1)), vjust = "inward", hjust = "inward") +
  geom_point(data = gammas1, mapping = aes(x = V1, y = V2)) +
  geom_segment(data = gammas1, aes(x = 0, y = 0, xend = V1, yend = V2),
               arrow = arrow(length = unit(0.2, "cm")), alpha = 0.75, color = "red") +
  geom_text(data = gammas1,
            aes(x = V1, y = V2, label = paste0("E", 1:nrow(gammas1))),
            vjust = "inward", hjust = "inward") +

```

```

scale_x_continuous(
    limits = c(-max(abs(c(range(alphas1[, 1:2], gammas1[, 1:2])))),
              , max(abs(c(range(alphas1[, 1:2], gammas1[, 1:2]))))) +
scale_y_continuous(
    limits = c(-max(abs(c(range(alphas1[, 1:2], gammas1[, 1:2])))),
              , max(abs(c(range(alphas1[, 1:2], gammas1[, 1:2]))))) +
labs(title = "OLS", x = expression(PC[1]), y = expression(PC[2])) +
theme_bw() +
theme(plot.title = element_text(hjust = 0.5))
print(BiplotOLS3)

fm3 <-
bayes_ammi(
  .data = cultivo2009
  , .y      = y
  , .gen    = entry
  , .env    = site
  , .rep    = rep
  , .nIter = 200
)
Mean_Alphas <- tibble:::as_tibble(matrix(colMeans(fm3$alphas1), ncol = 11))
Mean_Gammas <- tibble:::as_tibble(matrix(colMeans(fm3$gammas1), ncol = 11))

# Biplots Bayesian
BiplotBayes1 <-
ggplot(data = Mean_Alphas, mapping = aes(x = V1, y = V2)) +
geom_point() +
geom_hline(yintercept = 0) +
geom_vline(xintercept = 0) +
geom_text(aes(label = 1:nrow(Mean_Alphas)),
          vjust = "inward"
          , hjust = "inward") +
scale_x_continuous(
    limits = c(-max(abs(c(range(Mean_Alphas[, 1:2])))),
              , max(abs(c(range(Mean_Alphas[, 1:2]))))) +
scale_y_continuous(
    limits = c(-max(abs(c(range(Mean_Alphas[, 1:2])))),
              , max(abs(c(range(Mean_Alphas[, 1:2]))))) +
labs(title = "Bayes", x = expression(u[1]), y = expression(u[2])) +
theme_bw() +
theme(plot.title = element_text(hjust = 0.5))

print(BiplotBayes1)

BiplotBayes2 <-
ggplot(data = Mean_Gammas, mapping = aes(x = V1, y = V2)) +
geom_point() +
geom_hline(yintercept = 0) +
geom_vline(xintercept = 0) +

```

```

geom_text(aes(label = 1:nrow(Mean_Gammas)), vjust = "inward", hjust = "inward") +
scale_x_continuous(
  limits = c(-max(abs(c(range(Mean_Gammas[, 1:2])))),
            max(abs(c(range(Mean_Gammas[, 1:2]))))) +
scale_y_continuous(
  limits = c(-max(abs(c(range(Mean_Gammas[, 1:2])))),
            max(abs(c(range(Mean_Gammas[, 1:2]))))) +
labs(title = "Bayes", x = expression(v[1]), y = expression(v[2])) +
theme_bw() +
theme(plot.title = element_text(hjust = 0.5))

print(BiplotBayes2)

BiplotBayes3 <-
ggplot(data = Mean_Alphas, mapping = aes(x = V1, y = V2)) +
geom_point() +
geom_hline(yintercept = 0) +
geom_vline(xintercept = 0) +
geom_text(aes(label = 1:nrow(Mean_Alphas)),
          vjust = "inward", hjust = "inward") +
geom_point(data = Mean_Gammas, mapping = aes(x = V1, y = V2)) +
geom_segment(data = Mean_Gammas,
             aes(x = 0, y = 0, xend = V1, yend = V2),
             arrow = arrow(length = unit(0.2, "cm")))
             , alpha = 0.75, color = "red") +
geom_text(data = Mean_Gammas,
          aes(x = V1, y = V2,
              label = paste0("E", 1:nrow(Mean_Gammas))),
          vjust = "inward", hjust = "inward") +
scale_x_continuous(
  limits = c(-max(abs(c(range(Mean_Alphas[, 1:2]), Mean_Gammas[, 1:2]))),
            max(abs(c(range(Mean_Alphas[, 1:2]), Mean_Gammas[, 1:2]))))) +
scale_y_continuous(
  limits = c(-max(abs(c(range(Mean_Alphas[, 1:2]), Mean_Gammas[, 1:2]))),
            max(abs(c(range(Mean_Alphas[, 1:2]), Mean_Gammas[, 1:2]))))) +
labs(title = "Bayes", x = expression(PC[1]), y = expression(PC[2])) +
theme_bw() +
theme(plot.title = element_text(hjust = 0.5))

print(BiplotBayes3)

```

## Description

cultivo2008 is used for performing Genotypes by Environment Interaction (GEI) Analysis.

## Usage

```
data(cultivo2008)
```

## Format

A `data.frame` 1320 obs. of 6 variables.

## Details

- Gen Genotype
- Institute Institute
- Rep Replicate
- Block Block
- Env Environment
- Yield Yield Response

## Author(s)

1. Muhammad Yaseen (<[myaseen208@gmail.com](mailto:myaseen208@gmail.com)>)
2. Diego Jarquin (<[diego.jarquin@gmail.com](mailto:diego.jarquin@gmail.com)>)
3. Sergio Perez-Elizalde (<[sergiop@colpos.mx](mailto:sergiop@colpos.mx)>)
4. Juan Burgueño (<[j.burgueno@cgiar.org](mailto:j.burgueno@cgiar.org)>)
5. Jose Crossa (<[j.crossa@cgiar.org](mailto:j.crossa@cgiar.org)>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear–Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
```

---

cultivo2009

*Data for Genotypes by Environment Interaction (GEI)*

---

## Description

cultivo2009 is used for performing Genotypes by Environment Interaction (GEI) Analysis.

## Usage

```
data(cultivo2009)
```

## Format

A `data.frame` 1320 obs. of 6 variables.

## Details

- Gen Genotype
- Institute Institute
- Rep Replicate
- Block Block
- Env Environment
- Yield Yield Response

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)
2. Diego Jarquin (<diego.jarquin@gmail.com>)
3. Sergio Perez-Elizalde (<sergiop@colpos.mx>)
4. Juan Burgueño (<j.burgueno@cgiar.org>)
5. Jose Crossa (<j.crossa@cgiar.org>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2009)
```

---

e\_eff

*Environment Effects*

---

## Description

Calcuates Environment Effects

## Usage

```
## Default S3 method:  
e_eff(.data, .y, .gen, .env)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor

## Value

Environment Effects

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear–Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)  
e_eff(  
  .data = cultivo2008  
  , .y = y  
  , .gen = entry  
  , .env = site  
)
```

---

ge\_ammi*AMMI of Genotype by Environment Interaction Model*

---

## Description

Performs Additive Main Effects and Multiplication Interaction Analysis of Genotype by Environment Interaction Model

## Usage

```
ge_ammi(.data, .y, .gen, .env, .rep)

## Default S3 method:
ge_ammi(.data, .y, .gen, .env, .rep)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor
.rep	Replication Factor

## Value

Genotype by Environment Interaction Model

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
fm1 <-
  ge_ammi(
    .data  = cultivo2008
    , .y    = y
    , .gen   = entry
```

```
, .env  = site  
, .rep  = rep  
)  
  
data(cultivo2009)  
fm2 <-  
  ge_ammi(  
    .data  = cultivo2009  
    , .y    = y  
    , .gen   = entry  
    , .env   = site  
    , .rep   = rep  
)
```

---

**ge\_eff***Genotype by Environment Interaction Effects*

---

**Description**

Calculates Genotype by Environment Interaction Effects

**Usage**

```
## Default S3 method:  
ge_eff(.data, .y, .gen, .env)
```

**Arguments**

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor

**Value**

Genotype by Environment Interaction Effects

**Author(s)**

1. Muhammad Yaseen (<myaseen208@gmail.com>)

**References**

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
ge_eff(
  .data  = cultivo2008
  , .y    = y
  , .gen   = entry
  , .env   = site
)
```

*ge\_mean*

*Genotype by Environment Interaction Means*

## Description

Calculates Genotype by Environment Interaction Means

## Usage

```
## Default S3 method:
ge_mean(.data, .y, .gen, .env)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor

## Value

Genotype by Environment Interaction Means

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
ge_mean(
  .data  = cultivo2008
, .y     = y
, .gen   = entry
, .env   = site
)
```

ge\_model

*Genotype by Environment Interaction Model*

## Description

Calculates Genotype by Environment Interaction Model

## Usage

```
ge_model(.data, .y, .gen, .env, .rep)

## Default S3 method:
ge_model(.data, .y, .gen, .env, .rep)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor
.rep	Replication Factor

## Value

Genotype by Environment Interaction Model

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear–Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
fm1 <-
  ge_model(
    .data  = cultivo2008
    , .y    = y
    , .gen   = entry
    , .env   = site
    , .rep   = rep
  )
```

ge\_var

*Genotype by Environment Interaction Variances*

## Description

Calculates Genotype by Environment Interaction Variances

## Usage

```
## Default S3 method:
ge_var(.data, .y, .gen, .env)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor

## Value

Genotype by Environment Interaction Variances

## Author(s)

1. Muhammad Yaseen (<[myaseen208@gmail.com](mailto:myaseen208@gmail.com)>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
ge_var(
  .data  = cultivo2008
  , .y    = y
  , .gen   = entry
  , .env   = site
)
```

g\_eff

*Genotype Effects*

## Description

Calcuates Genotype Effects

## Usage

```
## Default S3 method:
g_eff(.data, .y, .gen, .env)
```

## Arguments

.data	data.frame
.y	Response Variable
.gen	Genotypes Factor
.env	Environment Factor

## Value

Genotype Effects

## Author(s)

1. Muhammad Yaseen (<myaseen208@gmail.com>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear-Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

## Examples

```
data(cultivo2008)
g_eff(
  .data  = cultivo2008
  , .y    = y
  , .gen   = entry
  , .env   = site
)
```

matrix_k	<i>k Matrix</i>
----------	-----------------

## Description

Gives k matrix

## Usage

```
matrix_k(n)

## Default S3 method:
matrix_k(n)
```

## Arguments

n                  Number of columns

## Value

Matrix

## Author(s)

1. Muhammad Yaseen (<[myaseen208@gmail.com](mailto:myaseen208@gmail.com)>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear–Bilinear Models Applied to Plant Breeding Trials With Genotype  $\times$  Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

---

orthnorm	<i>Orthogonal Normalization</i>
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## Description

Perform Orthogonal Normalization of a matrix

## Usage

```
orthnorm(u = NULL, basis = TRUE, norm = TRUE)

## Default S3 method:
orthnorm(u = NULL, basis = TRUE, norm = TRUE)
```

## Arguments

u	Matrix
basis	Logical argument by default TRUE
norm	Logical argument by default TRUE

## Value

Matrix

## Author(s)

1. Muhammad Yaseen (<[myaseen208@gmail.com](mailto:myaseen208@gmail.com)>)

## References

Perez-Elizalde, S., Jarquin, D., and Crossa, J. (2011) A General Bayesian Estimation Method of Linear–Bilinear Models Applied to Plant Breeding Trials With Genotype × Environment Interaction. *Journal of Agricultural, Biological, and Environmental Statistics*, 17, 15–37. ([doi:10.1007/s13253-011-0063-9](https://doi.org/10.1007/s13253-011-0063-9))

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