

BLUP

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# General Principle

- ▶ All methods to predict breeding values follow the same principle
  1. Correct information sources for some population mean
  2. Multiply corrected information source by an appropriate factor

- ▶ Regression Method

$$\hat{u} = b(y - \mu)$$

- ▶ Selection Index

- ▶ uses all available information combined into an index

## Selection Index

- ▶ will be presented later to estimate aggregate genotype
- ▶ Idea: all available information about an animals breeding value is combined into an index of merit ( $I$ )
- ▶ corresponds to multiple regression approach

$$\hat{u} = I = b_1 * y_1^* + b_2 * y_2^* + \dots + b_k * y_k^* = b^T y^*$$

where  $b$  the regression coefficients are computed such that the variance ( $\text{var}(u - \hat{u})$ ) of the error is minimal.

# Index Weights

- Minimization of the variance of the errors means

$$PEV = \text{var}(u - \hat{u}) = \text{var}(u - l) = \text{var}(u - b^T y^*)$$

$$= \text{var}(u) + \text{var}(b^T y^*) - 2\text{cov}(u, (y^*)^T b)$$

$$= \sigma_u^2 + b^T * \text{var}(y^*) * b - 2 * b^T * \text{cov}(u, (y^*)^T)$$

$$= \sigma_u^2 + b^T * P * b - 2 * b^T * G$$

## Solution

► Compute  $\frac{\partial PEV}{\partial b} = 0$

$$\frac{\partial PEV}{\partial b} = 2 * P * b - 2 * G = 0$$

$$\rightarrow b = P^{-1} * G$$

# Problem with Correction

- ▶ Population mean is ideal as correction

$$y = \mu + u + e \quad \rightarrow \quad \bar{y} = \bar{\mu} + \bar{u} + \bar{e} = \mu$$

- ▶ Because performances are observed in different
  - ▶ environments and
  - ▶ time points
- ▶ Formation of comparison groups where animals are exposed to the same environments
- ▶ The more groups, the better the correction of environmental effects
- ▶ The more groups, the smaller the single groups

# Bias

- ▶ With small comparison groups, it is more likely that mean breeding value of animals in a single group is not 0
- ▶ Average performance of all animals in a comparison group

$$\bar{y}_{CG} = \mu + \bar{u}_{CG} + \bar{e}_{CG}$$

\* If  $\bar{u}_{CG}$  is not 0, the predicted breeding value  $\hat{u}_i$  of animal  $i$  is

$$\begin{aligned}\hat{u}_i &= I = b(y_i - (\mu + \bar{u}_{CG})) \\ &= b(y_i - \mu) - b\bar{u}_{CG} \\ &= \hat{u}_i - b\bar{u}_{CG}\end{aligned}$$

where  $b\bar{u}_{CG}$  is called bias.

# Solution - BLUP

- ▶ Solution to correction problem in selection index: BLUP
- ▶ Estimates environmental effects at the same time as breeding values are predicted
- ▶ Linear mixed effects model
- ▶ Meaning of BLUP
  - ▶ **B** stands for **best** → correlation between true ( $u$ ) and its prediction ( $\hat{u}$ ) is maximal or the prediction error variance ( $\text{var}(u - \hat{u})$ ) is minimal.
  - ▶ **L** stands for **linear** → predicted breeding values are linear functions of the observations ( $y$ )
  - ▶ **U** stands for **unbiased** → expected values of the predicted breeding values are equal to the true breeding values
  - ▶ **P** stands for **prediction**



## Example

Animal	Sire	Dam	Herd	Weaning Weight
12	1	4	1	2.61
13	1	4	1	2.31
14	1	5	1	2.44
15	1	5	1	2.41
16	1	6	2	2.51
17	1	6	2	2.55
18	1	7	2	2.14
19	1	7	2	2.61
20	2	8	1	2.34
21	2	8	1	1.99
22	2	9	1	3.10
23	2	9	1	2.81
24	2	10	2	2.14
25	2	10	2	2.41
26	3	11	2	2.54
27	3	11	2	3.16

# Linear Models

- ▶ Simple linear model

$$y_{ij} = \mu + \textit{herd}_j + e_{ij}$$

- ▶ Result: Estimate of effect of herd  $j$
- ▶ What about breeding value  $u_i$  for animal  $i$ ?
  - ▶ Problem: breeding values have a variance  $\sigma_u^2$
  - ▶ Cannot be specified in simple linear model

→ **Linear Mixed Effects Model (LME)**

$$y_{ijk} = \mu + \beta_j + u_i + e_{ijk}$$

# Matrix-Vector Notation

- ▶ LME for all animals of a population

→ use matrix-vector notation

$$y = X\beta + Zu + e$$

where

- $y$  vector of length  $n$  of all observations
- $\beta$  vector of length  $p$  of all fixed effects
- $X$   $n \times p$  design matrix linking the fixed effects to the observations
- $u$  vector of length  $n_u$  of random effects
- $Z$   $n \times n_u$  design matrix linking random effect to the observations
- $e$  vector of length  $n$  of random residual effects.

# Expected Values and Variances

- ▶ Expected values

$$E(u) = 0 \text{ and } E(e) = 0 \rightarrow E(y) = X\beta$$

- ▶ Variances

$$\text{var}(u) = G \text{ and } \text{var}(e) = R$$

with  $\text{cov}(u, e^T) = 0$ ,

$$\text{var}(y) = Z * \text{var}(u) * Z^T + \text{var}(e) = ZGZ^T + R = V$$

## The Solution

$$\hat{u} = GZ^T V^{-1}(y - X\hat{\beta})$$

$$\hat{\beta} = (X^T V^{-1} X)^{-1} X^T V^{-1} y$$

## Mixed Model Equations

$$\begin{bmatrix} X^T R^{-1} X & X^T R^{-1} Z \\ Z^T R^{-1} X & Z^T R^{-1} Z + G^{-1} \end{bmatrix} \begin{bmatrix} \hat{\beta} \\ \hat{u} \end{bmatrix} = \begin{bmatrix} X^T R^{-1} y \\ Z^T R^{-1} y \end{bmatrix}$$

# Sire Model

- ▶ Breeding value of sire as random effect:

$$y = X\beta + Zs + e$$

## Example

$$\begin{bmatrix} 2.61 \\ 2.31 \\ 2.44 \\ 2.41 \\ 2.51 \\ 2.55 \\ 2.14 \\ 2.61 \\ 2.34 \\ 1.99 \\ 3.1 \\ 2.81 \\ 2.14 \\ 2.41 \\ 2.54 \\ 3.16 \end{bmatrix} = \begin{bmatrix} 1 & 0 \\ 1 & 0 \\ 1 & 0 \\ 1 & 0 \\ 0 & 1 \\ 0 & 1 \\ 0 & 1 \\ 0 & 1 \\ 1 & 0 \\ 1 & 0 \\ 1 & 0 \\ 0 & 1 \\ 0 & 1 \\ 0 & 1 \\ 0 & 1 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} \beta_1 \\ \beta_2 \end{bmatrix} + \begin{bmatrix} 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} s_1 \\ s_2 \\ s_3 \end{bmatrix} + \begin{bmatrix} e_1 \\ e_2 \\ e_3 \\ e_4 \\ e_5 \\ e_6 \\ e_7 \\ e_8 \\ e_9 \\ e_{10} \\ e_{11} \\ e_{12} \\ e_{13} \\ e_{14} \\ e_{15} \\ e_{16} \end{bmatrix}$$



# Animal Model

- ▶ Breeding value for all animals as random effects

$$y = X\beta + Zu + e$$