

Weight evaluation of Tabapuã cattle raised in northeastern Brazil using random-regression models

[Avaliação do peso de bovinos Tabapuã criados no Nordeste do Brasil utilizando-se modelos de regressão aleatória]

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ABSTRACT

The objective of this study is to compare random-regression models used to describe changes in evaluation parameters for growth in Tabapuã bovine raised in the Northeast of Brazilian. The M4532-5 random-regression model was found to be best for estimating the variation and heritability of growth characteristics in the animals evaluated. Estimates of direct additive genetic variance increased with age, while the maternal additive genetic variance demonstrated growth from birth to up to nearly 420 days of age. The genetic correlations between the first four characteristics were positive with moderate to large ranges. The greatest genetic correlation was observed between birth weight and at 240 days of age (0.82). The phenotypic correlation between birth weight and other characteristics was low. The M4532-5 random-regression model with 39 parameters was found to be best for describing the growth curve of the animals evaluated providing improved selection for heavier animals when performed after weaning. The interpretation of genetic parameters to predict the growth curve of cattle may allow the selection of animals to accelerate slaughter procedures.

Keywords: age, covariance functions, growth curve, legendre polynomials, livestock

RESUMO

Objetivou-se com esta pesquisa comparar diferentes modelos de regressão aleatória e determinar o mais adequado para descrever mudanças nos parâmetros de avaliação do crescimento de bovinos da raça Tabapuã criados no Nordeste brasileiro. O modelo de regressão aleatória M4532-5 foi definido como sendo o de melhor ajuste para descrição das estimativas de variância e herdabilidades das características de crescimento dos animais avaliados. As estimativas de variância genética aditiva direta aumentaram em função da idade, já as de variância genética aditiva materna mostraram crescimento do nascimento até próximo aos 420 dias. As correlações genéticas entre as quatro primeiras características foram positivas e de magnitudes moderada a alta. A maior correlação genética foi observada entre o peso ao nascer e aos 240 dias (0,82). A correlação fenotípica entre peso ao nascimento e demais características foi baixa. O modelo de regressão aleatória M4532-5 com 39 parâmetros apresentou-se como aquele de melhor ajuste para descrever a curva de crescimento dos animais avaliados. Resposta à seleção para obtenção de animais mais pesados será eficiente quando realizada em idades posteriores ao desmame. Ao se avaliar a curva de crescimento de bovinos por meio da interpretação dos parâmetros genéticos estimados, é possível selecionar animais com maior precocidade de abate.

Palavras-chave: curva de crescimento, funções de covariância, idade, pecuária, polinômios de Legendre

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INTRODUCTION

Brazil is a major producer of the world's food, with favorable climatic conditions and soil for livestock production, especially for cattle. In 2012, the country possessed approximately 211 million animals, of which, around 140 million were suitable for meat production (Sistema..., 2012). However, the beef production systems in Brazil require improvements in their efficiency to increase productivity and competitiveness (Campos *et al.*, 2013). Accordingly, the use of animal breeding tools is of importance, especially for the selection of genetically-superior animals with characteristics of economic importance. Parameters, for example, that characterize the growth curve of animals, based on their weights at different ages are extremely useful. Such longitudinal data are commonly analyzed with infinite-dimensional models, such as random regression (MRA), as they monitor the average-growth curve of the animals in a given period of time (Malhado *et al.*, 2008).

The random-regression models, used for the evaluation of longitudinal data, such as growth characteristics, are even more accurate than uni models. These employ multi characteristics to provide animal weight information and do not require standardization or pre adjustments (Albuquerque; El Faro, 2008; Baldi *et al.*, 2010; Sousa Júnior *et al.*, 2010). To adjust random-regression models, a covariance matrix of infinite size is required and an effective alternative is the use of covariance functions. These continuous functions are used for the estimation of variance and covariance of a characteristic measured at different points of a trajectory (Sousa Júnior *et al.*, 2014).

Accordingly, this study aimed to compare different random-regression models in order to determine the most appropriate for predicting changes in the growth parameters of Tabapuã cattle raised in the Northeast of Brazil.

$$y_{ij} = F + \sum_{m=0}^{k_b-1} b_m \phi_m(t_i) + \sum_{m=0}^{k_A-1} \alpha_{jm} \phi_m(t_{ij}) + \sum_{m=0}^{k_M-1} \gamma_{jm} \phi_m(t_{ij}) + \sum_{m=0}^{k_C-1} \delta_{jm} \phi_m(t_{ij}) + \sum_{m=0}^{k_O-1} \rho_{jm} \phi_m(t_{ij}) + \varepsilon_{ij};$$

Where: y_{ij} = i^{th} measure relating to the j^{th} animal; F = set of fixed effects; b_m = fixed regression coefficient for modeling the average curve of the population; $\phi_m(t_i)$ = regression function that

MATERIAL AND METHODS

The weight records of 3,172 Tabapuã cattle, aged from 0 to 660 days, and born between the years 1984 and 2004 were analyzed. These data were obtained from herds of three states in the Northeast of Brazil (Alagoas, Sergipe and Maranhão) and provided by the Brazilian Association of Zebu Breeders (BAZB). After analysis of data consistency and restrictions, carried out with the help of SAS® software (Statistical Analysis System 9.0) (Statistical..., 2003), the final set of data contained 1.505 records (Table 1). Animals with less than three recordings of weight and / or contemporary groups with less than three animals were eliminated. The following criteria were used for the formation of contemporary groups; sex, month and year of birth and weight, farm of birth and rearing conditions (pasture breeding system). Data was classified into 118 age groups for evaluation.

Table 1. Composition of the data file

Data analyzed	Number
Total records	1 505
Animals in the relationship matrix	589
Animals with records	335
Animals with 03 records	102
Animals with 04 records	84
Animals with 05 records	46
Animals with 06 records	88
Animals with 07 records	15
Bulls	77
Cows	512
Contemporary groups	255

For the different random-regression models tested, fixed effects of the contemporary group and the covariates of the age of the cow at calving (quadratic effect) were taken into consideration. Genetic effects, direct and maternal additive values were defined as random effects in addition to the direct and maternal permanent environmental effects. The general model may be represented as below:

describes the average curve of the population, according to the age of the animal; $\phi_m(t_{ij})$ = regression functions describing the trajectories of each j 's individual, according to age (t_i), for,

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maternal additive direct and maternal permanent environment additive genetic random effects; α_{jm} , γ_{jm} , δ_{jm} , ρ_{jm} = direct and maternal additive, direct and maternal permanent environmental genetic regression coefficients, respectively, for

each animal; k_b , k_A , k_M , k_C e k_Q = order of polynomials to be adjusted; ε_{ij} = random error associated with each i 's age from j 's animal.

In matrix form, the model is as follows:

$$Y = X\beta + Z_1\alpha + Z_2\gamma + W_1\delta + W_2\lambda + \varepsilon$$

$$V \begin{bmatrix} \alpha \\ \gamma \\ \delta \\ \lambda \\ \varepsilon \end{bmatrix} = \begin{bmatrix} K_A \otimes A & 0 & 0 & 0 & 0 \\ 0 & K_M \otimes A & 0 & 0 & 0 \\ 0 & 0 & K_C \otimes I_{N_a} & 0 & 0 \\ 0 & 0 & 0 & K_Q \otimes I_{N_m} & 0 \\ 0 & 0 & 0 & 0 & R \end{bmatrix};$$

Where: Y = vector of observations; β = vector of fixed effects; α = random vector of direct additive genetic coefficients; γ = random vector of genetic maternal additive coefficients; δ = direct permanent environmental coefficient vector; λ = maternal permanent environmental coefficient vector; X , Z_1 , Z_2 , W_1 , W_2 = corresponding incidence matrices; K_A , K_M , K_C e K_Q = matrices of variance and covariance between random regression coefficients for genetic additive direct and maternal effects and direct and maternal permanent environment, respectively; A = relationship matrix; I = identity matrix; N_a and N_m = number of animals with data and number of mothers, respectively; R = residual variance matrix; ε = residual vector.

methods penalizes more parameterized models by determining the most parsimonious model, i.e. sets the most appropriate model, in this case to explain the cattle growth phenomenon (Sousa Júnior *et al.*, 2010). The representation of the criteria cited is below:

$$\text{AIC} = -2 \log L + 2p$$

$$\text{e BIC} = -2 \log L + p \log (N-r(X)),$$

Where p = the number of model parameters; N = the total number of observations; and the r = the stand of the matrix X (which represents the incidence matrix of fixed effects). It is noteworthy that smaller values of AIC and BIC criteria describe a better fit model.

RESULTS AND DISCUSSION

The covariance components were estimated through restricted maximum verisimilitude method, using the WOMBAT statistical program (Meyer, 2006). Orthogonal Legendre polynomials were used from Monday to Friday, modeling order in the random effects mentioned above. Five classes of variance were used for the residual modeling.

Considering the criteria of Akaike (AIC) and Bayesian Schwarz (BIC), the M4532-5 random-regression model that takes into account direct and maternal genetic and direct and maternal permanent environmental effects, respectively, with five classes of residual variance and 39 parameters, was considered the best fit model for description of estimates of variance and heritability of the growth characteristics of the animals evaluated (Table 2). According to Pelicioni *et al.* (2009), less parameterized models are defined as more parsimonious as they save time during the convergence of computer program analyzes.

Five models of random regression with five residual variance classes were tested (M4522-5, M4532-5, M4533-5, M4633-5 and M5633-5). These models were compared using the verisimilitude function ($L \log$), plus the Akaike information criterion (AIC) and Bayesian Schwarz (BIC) and the BIC criterion, considered the most rigorous by penalizing more parameterized models (El Faro; Albuquerque, 2003). The use of these types of comparison

Table 2. Random regression models evaluated with five residual variance classes

Model	Statistical criteria*				
	Rvc	Np	log L	AIC	BIC
M4522	05	36	-4070.020	8216.940	8214.60
M4532	05	39	-4069.267	8216.534	8214.20
M4533	05	42	-4069.267	8222.534	8226.32
M4633	05	48	-4060.468	8216.936	8214.61
M5633	05	53	-4060.397	8226.794	8227.07

*Rvc = residual variance class; Np = number of model parameters; log L = log-likelihood function; AIC = Akaike information criterion; BIC = Bayesian information criterion of Schwarz.

Estimates of direct additive genetic variance increased with age (Figure 1), corroborating the study of Martínez Niño *et al.* (2012) and showing that there is satisfactory genetic variability in weight gain when selection is made at later ages after the weaning stage. On the other hand, the maternal additive genetic effect presented an increase from birth to 420 days of age, thereafter decreasing until 660 days. This finding differs from those commonly reported in studies with Zebu cattle, where maternal variance values are described as being more significant from the time of birth until weaning phase, which occurs at 205 days of age on average. Different profiles have been observed in studies conducted by Ribeiro *et al.* (2007) and Albuquerque and El Faro (2008) when evaluating the growth characteristics of Tabapuã and Nelore cattle.

The estimates of variance for environmental effects (direct and maternal) presented different behaviors (Figure 1); while the variation in the primary environmental effect increased from birth until approximately 600 days of age, with a slight drop from this point until the end of the study period (660 days), the maternal permanent environment variance presented a linear behavior, i.e. did not present any change in the range evaluated without biological justification for such an event. Sousa Júnior *et al.* (2010) found contrasting results, demonstrating that the estimated variance increased from birth to 660 days of age. The estimate of phenotypic variance increased early on up to 240 days and, after this period, showed a slight drop. A more significant increase was then observed up to older ages (Figure 1). Similar results were observed by Amaral *et al.* (2014) who evaluated the growth of Nelore cattle in the Northeast of Brazil.

Finally, the estimated residual variance showed stable behavior from birth until 180 days, followed by a slight increase, and a drop after 240 days until later ages. A different result was observed by Boligon *et al.* (2009) (Weight = 0.505kg at weaning; weight = 0.980kg per year; yearling weight = 1.150kg) and Costa *et al.* (2011) in which the residual variance estimates increased during the post-weaning period and thereafter.

Estimates of direct heritability, in general, showed an increase at birth and during the following ages; however, there was a drop after 120 days that remained stable until 600 days of age, after which it increased again until the end of the study period (Figure 2). Laureano *et al.* (2011) suggested that studies finding high levels of direct heritability yearling weight did not include the maternal genetic effect in the model, possibly causing an overestimation in additive genetic variance. Similar results were observed by Dias *et al.* (2006) (Weight = 0.21 at weaning and yearling weight = 0.24) and Albuquerque and El Faro (2008) (Weight per year = 0.20 and Weight yearling = 0.38) with Zebu cattle, where the largest direct heritability values were obtained for measurements of yearling weight. This result can be explained by the fact that, at older ages, the maternal influence has less influence on the development of the animal and post-weaning growth, which becomes more influenced by environmental factors, such as nutritional management. However, Toral *et al.* (2009) found different direct heritability values from this study, especially in the post-weaning period in which the values were higher, decreasing and stabilizing thereafter (weaning weight = 0.18; Weight per year = 0.20 and yearling weight = 0.18).

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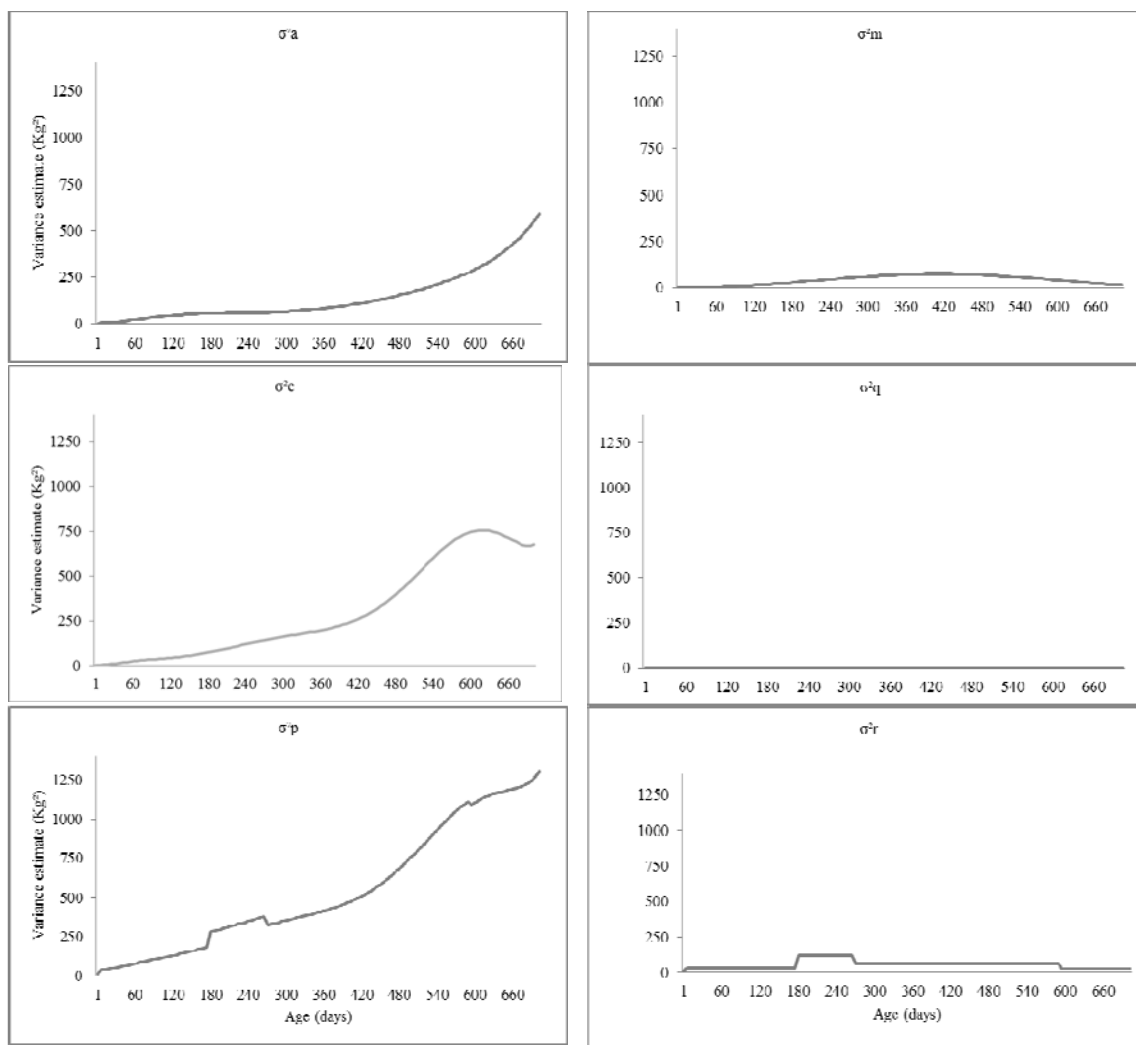


Figure 1. Estimates of direct additive genetic (σ^2_a) and maternal (σ^2_m), direct permanent environmental (σ^2_c) and maternal (σ^2_q), phenotypic (σ^2_p) and residual (σ^2_r) variance in weights from birth to 660 days of age in Tabapuã cattle, using a random-regression model with five residual variance classes (M4532-5).

In general, maternal heritability affected weight from birth up to approximately 300 days, with a smaller effect thereafter. Dias *et al.* (2006) found different heritability values and reported that the highest maternal heritability values were found before weaning, at around 150 days of age in Tabapuã cattle. Authors suggested that there may be a good response to the selection feature of maternal ability, based on weights before weaning, as a result of the greater maternal influence at this age.

Estimates of direct and maternal permanent environmental variance, as a proportion of the

total phenotypic variance, showed different behaviors. In general, the direct permanent environmental variance showed growth from birth to 600 days of age that decreased slightly at the end of the study period. In contrast, Boligon *et al.* (2010) and Palharim *et al.* (2013) found growth at later ages, with a slight drop after birth. In the estimate of maternal permanent environmental variance, results were of low magnitude and did not change throughout the study period, showing little relevance of the estimation of this variance for the data evaluated.

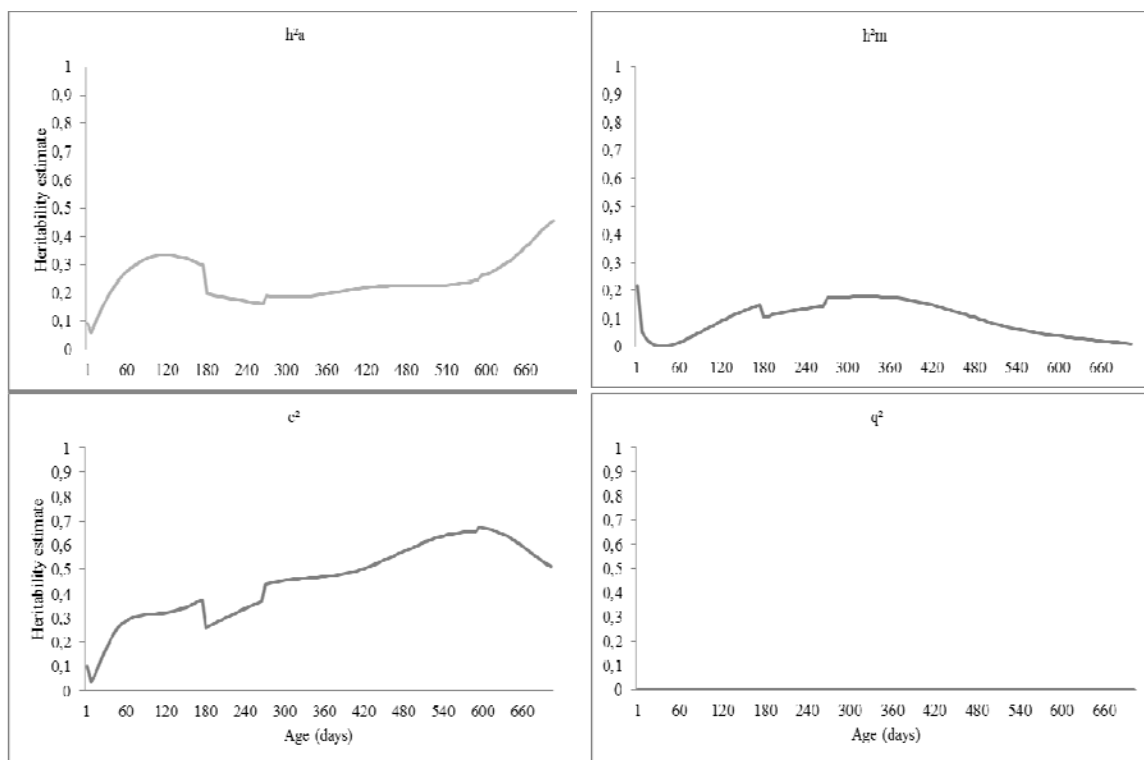


Figure 2. Heritability (h^2a) and maternal (h^2m), direct permanent environmental variance (c^2) and maternal (q^2) estimates as a function of the total phenotypic variance for weights from birth until 660 days of age in Tabapuã cattle, using a random-regression model with five classes of residual variance (M4532-5).

Estimates of the genetic correlations between the first four characteristics, PNxP240 (0.82), PNxP365 (0.81) and PNxP540 (0.66), were positive and of moderate to high magnitude (Table 3). However, the greatest genetic correlation was found between the characteristics; birth weight (BW) and weight per year (P365), which was 0.82 and decreased with age. These data indicate that selection for weight gain, when performed in young animals, can increase the size and birth weight of calves and lead to complications in childbirth, increasing the rate of dystocia in the herd.

Similar results for this parameter were found by Sousa Júnior *et al.* (2010). However, Mota *et al.* (2013) more recently related that the genetic correlation values increased during early ages for the yearling weight, resulting in a decrease in final weight. If we consider this final weight at 660 days as the same as that at adulthood, this finding is of interest as animals that are too heavy at this stage, raising production costs to maintain them in the herd. Another important

reason for avoiding high weight animals during older age, is that the preference of farmers is to produce younger animals according to growth and carcass.

High correlations between the characteristics that comprise the post-weaning period were observed; P240xP365 (0.97) P365xP540 (0.92) and P540xP660 (0.98) respectively. Sousa Júnior *et al.* (2011) also found high levels of post-weaning weight values; P365x450 (0.92), P365xP550 (0.89) and P450xP550 (0.93). According to Lira *et al.* (2008), this result indicates that most of the genes responsible for higher weights at ages after weaning are the same.

The phenotypic correlations presented two distinct findings (Table 3). The first found high correlations between the four P240x365 characteristics (0.80), P365x540 (0.84) and P540x660 (0.89), showing that selection for weight after weaning can increase the weights at later ages. Similar results for phenotypic

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correlations were found in studies by Albuquerque and El Faro (2008) and Sousa Júnior *et al.* (2010), when working with growth characteristics of Zebu animals. Additionally, the characteristic low-birth weight presented a correlation with all other phenotypic characteristics evaluated PNxP240 (0.28); PNxP365 (0.23); PNxP540 (0.29) and PNxP660 (0.33). Ribeiro *et al.* (2009) showed different

phenotypic correlation results in which the correlation values between birth weight and later ages were high and close to the unit. The low phenotypic correlation of birth weight with weights during subsequent ages, found in this study, may be explained by the reduced influence of maternal effect on animals following weaning, when environmental effects begin to have more effect on calves.

Table 3. Estimates of genetic correlations (above the diagonal values) and phenotypic correlations (values below the diagonal) for weights at different ages in Tabapuã cattle

¹ characteristic	BW	W240	W365	W540	W660
BW	-	0.82	0.81	0.66	0.56
W240	0.28	-	0.97	0.89	0.88
W365	0.23	0.80	-	0.92	0.96
W540	0.29	0.71	0.84	-	0.98
W660	0.33	0.69	0.78	0.89	-

¹Birth weight (BW); weight at 240 (P240), 365 (P365), 540 (P540) and 660 (P660) days of age.

CONCLUSIONS

The M4532-5 random-regression model with 39 parameters was the best model for the description of the growth curves for Tabapuã bovine raised in three states of northeastern Brazil (Alagoas, Sergipe and Maranhão); the selection for potentially heavier animals will be more effective when performed after weaning, however selection due to maternal characteristics may be of some success if employed before weaning; when evaluating the growth curve of cattle by interpretation of genetic, animals with a higher growth rate may be identified and selected, allowing the definition of those eligible for early slaughter.

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