

1 **Growth Curve of Dairy Artificial Insemination Bulls Raised under Thai Tropical**  
2 **Conditions**

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4 **Mattaneeya Sarakul<sup>a</sup>, Skorn Koonawootrittriron<sup>a,\*</sup>, Mauricio A. Elzo<sup>b</sup>, and Thanathip**  
5 **Suwanasopee<sup>a</sup>**

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7 <sup>a</sup> Department of Animal Science, Faculty of Agriculture, Kasetsart University, Bangkok  
8 10900, Thailand

9 <sup>b</sup> Department of Animal Sciences, University of Florida, Gainesville, FL 32611-0910, USA

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\* Corresponding author: Skorn Koonawootrittriron; E-mail: agrskk@ku.ac.th

## 11 **Abstract**

12           The objective of this research was to evaluate the growth curve of dairy artificial  
13 insemination bulls under Thai tropical conditions. Data consisted of 4,963 monthly body  
14 weights from 140 bulls from the Semen Production and Dairy Genetic Evaluation Center of  
15 the Dairy Promotion Organization of Thailand collected from 1996 to 2015. Four breed  
16 groups were defined based on Holstein (H) fraction: BG1 ( $0.96 \leq H \leq 1.00$ ), BG2 ( $0.91 \leq H <$   
17  $0.96$ ), BG3 ( $0.86 \leq H < 0.91$ ), and BG4 ( $0.44 \leq H < 0.86$ ). Linear (Quadratic) and nonlinear  
18 (Gompertz, Logistic, Von Bertalanffy and Brody) models were compared for goodness of fit  
19 using  $-2\log L$ , Akaike Information Criterion (AIC), Corrected AIC (AICC) and Bayesian  
20 Information Criterion (BIC). The model with the lowest values for these four criteria was  
21 Quadratic. Predicted weights at 30 mo and 60 mo of age were higher for bulls in BG2 than  
22 bulls in BG1, BG3, and BG4. Growth curves from these bulls would be useful to identify  
23 sires expected to produce steers with faster growth rates and heifers with younger ages at first  
24 calving. Unfortunately, weights from steer and heifer progeny from these bulls were  
25 unavailable. Consequently, progeny weights would need to be collected if genomic selection  
26 for growth traits were to be implemented in the Thai multibreed population.

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28 **Keywords:** Artificial insemination; Dairy bull; Growth curves; Tropical

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## 31 **Introduction**

32           Knowledge of growth patterns in cattle is important for making appropriate herd  
33 management, nutrition and selection decisions aimed at improving beef production  
34 efficiency. Although beef steers supply the majority of beef in Thailand, dairy steers are also  
35 fattened to cover beef shortages, to stabilize prices of beef products, and to provide a choice  
36 to consumers demanding high quality beef. Unfortunately, there is currently no information  
37 available on growth patterns and slaughter ages of dairy steers in either farms or feedlots in  
38 Thailand. However, weight data exists on Holstein (H) and Holstein crossbred bulls  
39 belonging to the Semen Production and Dairy Genetic Evaluation Center of the Dairy  
40 Farming Promotion Organization of Thailand (DPO) from near birth to eight years of age.  
41 These data could be used to gain knowledge on expected growth curves of their progeny fed  
42 in their own farms of origin or in feedlots as well as insights on expected mature weight of  
43 their daughters in dairy farms.

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45 Most cattle in the Thai dairy multibreed population have a high H percentage with  
46 various fractions of other *Bos taurus* (Brown Swiss, Jersey, Red Dane) and (or) *Bos indicus*  
47 (Brahman, Red Sindhi, Sahiwal and Thai Native) breeds (Koonawootrittriron *et al.*, 2009).  
48 Knowledge of growth curves of artificial insemination sires of various H fractions at the DPO  
49 would help identify sires whose steer progeny would be expected to have faster growth rates  
50 and shorter fattening times and whose daughters would be of moderate mature size. This  
51 would help improve genetic selection for growth and dairy production efficiency, which in  
52 turn would be expected to increase farm profitability. A variety of mathematical models can  
53 be used to analyze growth curves as well as to predict body weight from partial records  
54 including Brody (Brody, 1945), Von Bertalanffy (Von Bertalanffy, 1957), Logistic (Nelder,  
55 1961), Gompertz (Gompertz, 1825), and polynomial regression model. Thus, the objective of  
56 this research was to evaluate the growth curve of bulls from the Dairy Farming Promotion  
57 Organization of Thailand to obtain insights on expected slaughter age of steer progeny of  
58 various H percentages and on expected mature weights of their daughters using five  
59 mathematical models (Quadratic, Logistic, Gompertz, Von Bertalanffy, and Brody).

60

## 61 **Materials and Methods**

### 62 *Animals and data*

63 A total of 140 bulls from the Semen Production and Dairy Genetic Evaluation Center  
64 of the DPO were used in this research. These bulls were the progeny of 55 sires and 136  
65 dams. DPO personnel chose potential sires and dams of bulls based on EPD for milk  
66 production. Sires of bulls belonged to the Semen Production and Dairy Genetic Evaluation  
67 Center of the DPO and dams of bulls were from 59 dairy farms in Central, Northern,  
68 Northeastern, and Southern Thailand. Bulls were raised under the same nutritional regimen,  
69 management and health care at the Semen Production and Dairy Genetic Evaluation Center  
70 of the DPO located in Muaklek, Saraburi province, Thailand, [14°38'24.7" latitude North,  
71 101°11'57.2" longitude East].

72

73 The Thai multibreed population is the product of an upgrading process from various  
74 *Bos indicus* and *Bos taurus* breeds to Holstein. Breeds represented in the multibreed dairy  
75 population were Holstein, Brahman, Jersey, Red Dane, Red Sindhi, Sahiwal and Thai Native.  
76 Ninety four percent of the bulls in this population were H crossbreds, and the remaining 6%  
77 were purebred H. The average H fraction of bulls was 92.5% (minimum = 44%; maximum =  
78 100%). Considering the H percentage of the bulls in the population, four breed groups were

79 constructed: BG1 ( $0.96 \leq H \leq 1.00$ ); BG2 ( $0.91 \leq H < 0.96$ ); BG3 ( $0.86 \leq H < 0.91$ ) and BG4  
80 ( $0.44 \leq H < 0.86$ ). Numbers of animals per breed group and total, numbers of records per  
81 breed group and total, and number of records per animal per breed group and total are shown  
82 in Table 1.

83

84 The dataset consisted of monthly body weights ( $n = 4,963$ ) from 140 dairy bulls born  
85 from 1996 to 2015. Bulls were weighed monthly starting from birth until a bull completed  
86 25,000 doses of frozen semen or when a bull reached approximately 96 mo of age. Monthly  
87 body weights of bulls younger than 5.5 mo of age and older than 96 mo of age were excluded  
88 from the analysis because of missing and (or) erroneous information.

89

#### 90 *Climate, housing and management*

91 The weather characteristics in Central of Thailand are influenced by tropical  
92 monsoons, the Southwest monsoon from May to October and the Northeast monsoon from  
93 October to February. Temperatures in this region during the years of the study (1996 to  
94 2015) ranged from 15 °C to 34 °C, relative humidity (RH) fluctuated between 33% and 97%,  
95 and average rainfall averaged 1,113 mm/yr. Seasons were classified as winter (November to  
96 February; 14.5 °C to 31.6 °C, 65% RH, 50 mm rain/season), summer (March to June; 20.8 °C  
97 to 34.2 °C, 72% RH, 339 mm rain/season), and rainy (July to October; 23.2 °C to 31.8 °C,  
98 77% RH, 724 mm rain/season; Thai Meteorological Department, 2015).

99

100 Bulls were raised in open barns. Each bull was kept in a  $4 \times 22$  m<sup>2</sup> stall with a raised  
101 area and an exercise area. The raised area was  $4 \times 6$  m<sup>2</sup>, with a concrete floor and a tile roof  
102 (2.5 to 3 m high). The exercise area was  $4 \times 16$  m<sup>2</sup>, with dirt floor and no roof. Feed and  
103 water bunks were located in the front of the stall. Bulls were kept in their stalls at all times,  
104 except when semen was collected.

105

106 Bulls were fed 4 to 6 kg/d of concentrate (14 to 16% of CP) and had free access to  
107 fresh roughage, water, and a mineral supplement throughout the year. The concentrate was  
108 purchased from a local company (Charoen Pokphand Foods, Bangkok, Thailand). Its  
109 ingredients included protein sources (palm meal, soybean meal, cotton seed meal, leucaena),  
110 energy sources (cassava, rice bran, broken rice, fat from animals and plant, molasses), and  
111 mineral and vitamin sources (di-calcium and premixes). Fresh roughage consisted of Guinea  
112 (*Panicum maximum*), Ruzi (*Brachiaria ruziziensis*), Napier (*Pennisetum purpureum*), and

113 Para (*Brachiaria mutica*) grasses cut and carried to bull stalls. Bulls were also given Guinea  
 114 and Ruzi grass hay and silage during the dry season (November to March) when fresh grass  
 115 was scarce. Lastly, bulls were vaccinated against Foot and Mouth Disease (FMD),  
 116 Tuberculosis (TB), and were dewormed every six months.

117

### 118 *Statistical analysis*

119 Bull growth data were analyzed using the following five models:

120 Model 1: Quadratic

$$121 \quad y_t = b_0 + b_1 t + b_2 t^2 + e_t \quad (1)$$

122 Model 2: Gompertz (Gompertz, 1825)

$$123 \quad y_t = A \exp(-B \exp(-kt)) + e_t \quad (2)$$

124 Model 3: Logistic (Nelder, 1961)

$$125 \quad y_t = A (1 + B \exp(-kt))^{-1} + e_t \quad (3)$$

126 Model 4: Von Bertalanffy (Von Bertalanffy, 1957)

$$127 \quad y_t = A (1 - B \exp(-kt))^3 + e_t \quad (4)$$

128 Model 5: Brody (Brody, 1945)

$$129 \quad y_t = A (1 - B \exp(-kt)) + e_t \quad (5)$$

130

131 Where  $y_t$  is the body weight (kg) at age  $t$  (mo) corrected by contemporary group  
 132 (year-month of birth) and heterosis fixed effects,  $b_0$  is the initial body weight,  $b_1$  is the linear  
 133 regression coefficient,  $b_2$  is the quadratic regression coefficient,  $A$  is the asymptotic mature  
 134 weight,  $B$  is the degree of maturity at birth,  $k$  is the maturing rate, and  $e_t$  is the residual.

135 Model 1 was analyzed using the mixed procedure of SAS (SAS, 2011), whereas models two  
 136 to five were analyzed with the NLMIXED procedure of SAS.

137

138 Goodness of fit for the five models was assessed using four fit statistics: 1)  $-2\log L$ ,  
 139 where  $\log L$  is the natural logarithm of the likelihood function; 2) Akaike Information  
 140 Criterion (AIC) =  $-2\log L + 2k$ , where  $k$  is the number of parameters (Akaike, 1974); 3)  
 141 Corrected Akaike Information Criterion (AICC; Burnham and Anderson, 1998) =  $-2\log L +$   
 142  $2kn / (n - k - 1)$ , where,  $n$  is the number of observations, and  $k$  is the number of parameters;  
 143 and 4) Schwarz Bayesian information criterion (BIC; Schwarz, 1978) =  $-2\log L + k\log(n)$ .

144 The model with the smallest  $-2\log L$ , AIC, AICC and BIC values was chosen to be the best  
 145 for fitting bull growth curves in this population. The chosen model was used to compute

146 parameters for each of the four breed groups of bulls. Parameters for each breed group were  
147 used to compute weights at various ages to plot growth curves for the four breed groups.

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## 149 **Results and Discussion**

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### 151 *Growth data*

152 Fig.1 show a scatter plot of bull weights from 5.5 mo to 96 mo of age. This plot  
153 contains bull weights from all bulls collected at ages ranging from 5.5 mo to 96 mo of age.  
154 The average number of weights per bull was 35.6 (SD = 20.2). The scatter plot shows that  
155 bull growth followed relative straight path until approximately 60 mo of age, then it  
156 plateaued. These bull weight data can be utilized to obtain some information on the growth  
157 patterns of their steer progeny fed for beef (first 30 mo of age) and of their daughters reared  
158 as replacement dairy cows (all mo). Weights in Fig.1 could be divided into 3 phases: 1) Early  
159 growth: from 5.5 mo to 30 mo of age; 2) Late growth: from 30 mo to 60 mo of age; and 3)  
160 Maturity: after 60 mo of age, where body weight will fluctuate depending on environmental  
161 factors (climate, nutrition, health). These phases will be considered in the discussion of  
162 prediction models for bull growth and predicted growth curves for animals of four breed  
163 groups in the Thai multibreed population.

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### 165 *Overall goodness of fit of growth models*

166 Table 2 contains the values of the four goodness of fit statistics used to compare the  
167 five models used in this study. The Quadratic model had the smallest -2LogL, AIC, AICC,  
168 and BIC values, thus it was the model that best fitted the growth data from 5.5 mo to 96 mo  
169 of age. Model rankings were identical for -2LogL, AIC, and AICC (Quadratic, Logistic,  
170 Gompertz, Von Bertalanffy, and Brody), and these rankings were similarly identical to that of  
171 BIC where the Quadratic model was first, and Brody was fifth. Values of AIC, AICC and  
172 BIC differed because of the values of the adjustment factors applied to -2LogL. The AIC  
173 adjusts -2LogL by adding a penalty twice the number of parameters involved in each model  
174 ( $2k$ ), and AICC adjusts -2LogL for number of parameters  $k$  and sample size  $n$  ( $2kn/(n - k - 1)$ ).  
175 For large samples ( $n$  large), the AICC correction approaches  $2k$ , thus AICC approached AIC  
176 and both of them will tend to select the same model (Lee and Ghosh, 2009). Conversely, BIC  
177 includes a value of total model parameters multiplied by the natural logarithm of total records  
178 ( $k\log(n)$ ), which will increase as  $n$  increases, hence it is more a more stringent statistic than  
179 AIC and AICC (Cobuci et al., 2011; Dziak et al., 2012).

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No previous growth curve studies including Quadratic, and the four nonlinear models considered here (Gompertz, Brody, Von Bertalanffy, and Logistic) were found in the literature. Among nonlinear models, the Von Bertalanffy model was found to provide a better fit for growth curves than Gompertz, Logistic, Brody, and Richards in Holstein females (Berry et al., 2005). The Von Bertalanffy model also fitted growth better in a group of Holstein, Ayrshire and Holstein-Ayrshire crossbred females than Gompertz and Logistic models, which tended to overestimate early weights and to underestimate mature weights (Perotto et al., 1992; García-Muñiz et al., 1998). However, the Brody model fitted the growth curve of Jersey cows better than the Logistic, Von Bertalanffy, and Gompertz (Brown et al., 1976), although the best model occurred with the Richards function (Richards, 1959). In beef cattle, the Von Bertalanffy model fitted the growth curve of Spanish Retinta beef cows than Brody (López de Torre et al., 1992). Conversely, the Brody model provided a better fit to the growth curve of Nellore cattle than Gompertz and Von Bertalanffy (Forni et al., 2009), Hereford and Charolais-Angus-Galloway crossbred cattle than the Logistic and Von Bertalanffy models (Goonewardene et al., 1981), and Hereford and Brahman-Hereford crossbreds than the Logistic, Von Bertalanffy, and Gompertz (Brown et al., 1976). However, the Richards model (Richards, 1959) yielded the best growth curve fit in the last two studies (Brown et al., 1976; Goonewardene et al., 1981). Clearly, no single growth function provided a uniformly better fit across studies involving a variety of dairy and beef cattle breeds. In addition to the genetic composition of cattle and environmental conditions (management, nutrition, climate, health conditions), sample size may also have contributed to differences among models. Thus, although the Quadratic model was found to fit the growth of dairy bulls between 5.5 and 96 mo of age better than the other four models with the currently available data, this outcome may change in the future as additional data are collected.

#### 206 *Predicted growth curves by growth phase*

207 Table 3 presents estimates of parameters and their standard errors for the five models  
208 in this study, and Fig. 2 shows the corresponding bull growth curves predicted using these  
209 parameters. The plot of actual weights over age (Fig. 1) showed that the body weight of bulls  
210 in this study increased until they reached maturity at approximately 60 mo of age, then bull  
211 weights fluctuated and appeared to slightly decrease until 96 mo of age. The shape of the  
212 growth curves for the five models was similar during early and late growth, but differed at  
213 maturity. All models tended to fit growth in the early and late growth periods well. However,

214 mature weights tended to be underestimated by the Quadratic model and overestimated by the  
215 four nonlinear models.

216

217         A description of the predictive ability of the five models during the three growth  
218 stages is shown in Table 4 in terms of means and SD of differences between predicted and  
219 actual body weights during early growth, late growth, and maturity. The Logistic model  
220 generated the largest differences between predicted and actual weights of all models for early  
221 growth, whereas the Brody model generated the largest differences between predicted and  
222 actual weights for late growth and maturity. The Quadratic and Von Bertalanffy models  
223 tended to slightly overestimate bull weights during early growth (Quadratic: 2.67; Von  
224 Bertalanffy: 0.45), underestimate weights during late growth (Quadratic: -1.64; Von  
225 Bertalanffy: -4.94), and overestimate weights at maturity (Quadratic: 7.53; Von Bertalanffy:  
226 10.63). The Logistic model overestimated weights during early growth (13.31), slightly  
227 underestimated weights during late growth (-0.51), and overestimated weights at maturity  
228 (11.84) more than the other models, except Brody. The Gompertz model tended to  
229 underestimate weights during early growth (-1.50) and late growth (-3.59), and to  
230 overestimate weights at maturity (7.09). The Brody model overestimated weights during  
231 early growth (4.66), underestimated weights during late growth (-11.39), and grossly  
232 overestimated weights at maturity (18.06), producing the worst fit of all models in late  
233 growth and maturity. Considering the simplicity of the Quadratic model and the reasonably  
234 small differences in all growth phases, this model should be preferred to nonlinear models if  
235 genetic or genomic evaluation for growth traits were to be conducted in the Thai dairy  
236 multibreed population, particularly if applied using Legendre polynomials or Splines.

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238         To analyze the mean growth performance of the set of bulls here, weights at 5.5 mo, 30  
239 mo, and 60 mo of age were predicted using the best model (Quadratic). Predicted weights with  
240 the Quadratic model indicated that mean bull weight increased by an average of 445 kg during  
241 the early growth period (168 kg at 5.5 mo to 613 kg at 30 mo of age), and by 274 kg during the  
242 late growth period (613 kg 30 mo to 887 kg at 60 mo of age). This indicated a decrease in  
243 growth rate of 62% between early and late growth. A similar pattern of growth was found in  
244 US Holstein (Calo et al., 1973), where bull weight increased by 599 kg during early growth  
245 (218 kg at 6 mo to 817 kg at 30 mo of age) and by 197 kg (817 kg at 30 mo to 1014 kg at 60  
246 mo of age) during late growth, a decrease of 33% in their growth rate. Bull weights after 60



247 mo of age fluctuated around their mature weight because the feeding objective was to provide  
248 them with enough food to be an appropriate condition for artificial insemination. The pattern  
249 of growth observed in bulls from the Thai multibreed population reflected the typical cattle  
250 growth curve where there is an acceleration phase, then a point of inflection between early and  
251 late growth where the rate of growth decreases steadily until reaching maturity where bull  
252 weight remains relatively constant over time.

253

#### 254 *Predicted growth curves by breed group*

255 Quadratic regression coefficients were estimated for animals in each of the four breed  
256 groups specified according to their breed composition (Table 5). These within-breed group  
257 quadratic regression coefficients were used to compute predicted values for each animal at  
258 every age in all four breed groups. A description of the predicted ability of the Quadratic  
259 model in terms of means and SD of differences between predicted and actual weights in each  
260 growth period for each breed group and the complete dataset is presented in Table 6. The  
261 Quadratic model underestimated BG2 weights in all growth phases, tended to overestimate  
262 BG3 and BG4 weights, and yielded the closest predictions during early and late growth for  
263 BG1 than for any other breed group. Bull predicted weights were subsequently plotted  
264 against age to construct growth curves for the four breed groups (Fig. 3). Predicted weights  
265 of bulls in BG2 were higher than those from BG1, BG3, and BG4 during the early growth  
266 period (5.5 to 30 mo of age) and the late growth period (30 to 60 mo of age). The rate of  
267 growth of BG3 and BG4 bulls until 60 mo of age was lower than that of BG1 and BG2  
268 resulting in weights at 60 mo of age that were approximately 25 kg lower than those of BG1  
269 and BG2. Predicted weights of bulls at maturity tended to be higher for BG2 and BG3 than  
270 BG1 and BG4.

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272 The Quadratic model predicted weights indicated that bulls with an H fraction equal  
273 or greater than 96% (BG1) had the fastest rate of early growth and that bulls with an H  
274 fraction between 44% and 86% (BG4) had the lowest rate of late growth (Fig. 3). The  
275 predicted growth rate of bulls in BG1, BG2, and BG4 followed similar patterns throughout  
276 early growth, late growth and maturity. However, although the predicted growth rate of bulls  
277 in BG3 was lower than BG1, BG2, and BG4 during the early and late growth periods, it  
278 became higher than these breed groups at maturity. Caution should be exercised when  
279 interpreting the predicted weights from the Quadratic model in this population because of the

280 large SD of the differences between predicted and actual weights for all breed groups in all  
281 growth phases, particularly for BG3 in the early growth phase.

282

283 Meat demand in Thailand per year (181,000 tons, equivalent to 1.26 million animals)  
284 exceeds the amount of available meat from beef cow-calf operations (0.97 million animals;  
285 Osothongs et al., 2016). This unmet demand could be largely covered by feeding excess  
286 males from dairy cattle operations (509,524 animals). In a recent meat production study,  
287 crossbred steers of unknown H percentage had an average slaughter weight of 576.7 kg (SD  
288 =76.0 kg), carcass weight of 312.4 kg (SD = 42.8 kg), dressing percentage of 54.2 % (SD =  
289 2.3 %), and a marbling score of 1.8 (SD = 0.8; Pluemjai et al., 2016). The slaughter weight in  
290 this study (576.7 kg) was achieved at approximately 27 mo for BG1 and BG2, 28 mo for  
291 BG4, and 29 mo for BG3, suggesting that the higher the H percentage the shorter the time to  
292 slaughter (assuming a similar feeding regime in a feedlot). More intensive fattening regimens  
293 could be used to speed up growth and reduce age at slaughter. Growth curves of sires of  
294 feedlot steers could be used to help identify bulls whose steer progeny would be expected to  
295 have faster growth rates and shorter fattening times. Another use of bull growth information  
296 concerns replacement females that have enough growth capability to produce milk under the  
297 open-housing, feeding, and climate conditions in Thailand. Predicted bull mature weights for  
298 the four bull breed groups (Fig. 3) suggest that daughters of bulls in breed groups 2 and 3  
299 would tend to be larger than those from breed groups 1 and 4. However, these are phenotypic  
300 rather than genetic predictions. A selection program to select mature weight of replacement  
301 females would require genetic or genomic predictions of all animals in the breeding  
302 population (males and females) based on pedigree and weights collected at various ages, as  
303 well as genotypes for genomic predictions. Although genotypes are currently collected in the  
304 Thai multibreed dairy population, weights are not collected on either males or females.  
305 Perhaps a study addressing the economic advantages of genomic selection for meat  
306 production with dairy animals may encourage Thai dairy producers to collect weight  
307 information.

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309 The Quadratic model provided the best fit to the growth of dairy bulls in the Thai  
310 population between 5.5 and 96 mo of age. Bull predicted weights increased faster during the  
311 early growth phase (6 to 30 mo of age), slowed down during the late growth phase (30 to 60  
312 mo of age), and tended to decrease during the maturity phase (60 to 96 mo of age). Bulls in  
313 BG2 ( $0.91 \leq H < 0.96$ ) had the fastest rate of early growth, late growth, and maturity until

314 approximately 76 mo of age, when it was overtaken by bulls in BG3 ( $0.86 \leq H < 0.91$ ). Bulls  
315 in BG3 had the slowest rates during the early and late growth periods and ended up with the  
316 fastest rate during the maturity period. Bulls in BG1 and BG4 had intermediate growth rates  
317 between BG2 and BG4 during the early and late growth periods and were the slowest in the  
318 maturity period. Growth curves of bulls from Thai artificial insemination centers like the  
319 DPO would be useful to identify sires expected to produce steers with fast growth rates in the  
320 feedlot as well as heifers with younger ages at first calving. Unfortunately, weights from  
321 steer and heifer progeny from these bulls were unavailable. Consequently, weights from  
322 male and female progeny would need to be collected if genomic selection for growth traits  
323 were to be implemented in the Thai dairy multibreed population.

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332

### 333 **Conflict of interest**

334 The authors declare that they have no conflicts of interest.

335

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396 **Table 1** Number of animals, number of records and number of records per animal per breed group  
 397 and total  
 398

Breed group <sup>a</sup>	Number of animals	Number of records	Number of records per animal
BG1	63	2276	36
BG2	34	1300	38
BG3	24	767	32
BG4	19	620	33
Total	140	4963	36

399 <sup>a</sup>BG1 =  $0.96 \leq H \leq 1.00$ , BG2 =  $0.91 \leq H < 0.96$ , BG3 =  $0.86 \leq H < 0.91$ , and BG4 =  $0.44 \leq H < 0.86$   
 400

401 **Table 2** Comparison of growth models using -2log Likelihood (-2logL), Akaike Information Criterion  
 402 (AIC), Corrected Akaike Information Criterion (AICC), and Schwarz Bayesian Information  
 403 Criterion (BIC)  
 404

Model	-2logL	AIC	AICC	BIC
Quadratic	54068	54070	54070	54076
Logistic	54097	54105	54105	54131
Gompertz	54101	54109	54109	54135
Von Bertalanffy	54131	54139	54139	54165
Brody	54306	54314	54314	54340

405

406 **Table 3** Parameter values and standard errors by growth model  
 407

Model	Parameter <sup>a</sup>					
	b <sub>0</sub>	P-value	b <sub>1</sub>	P-value	b <sub>2</sub>	P-value
Quadratic	37.77 ± 3.46	0.0001	24.25 ± 0.18	0.0001	-0.1681 ± 0.0021	0.0001
	A		B		K	
Logistic	912.92 ± 3.36	0.0001	0.0671 ± 0.0007	0.0001	3.0427 ± 0.0302	0.0001
Gompertz	923.31 ± 3.63	0.0001	2.3134 ± 0.0251	0.0001	0.0592 ± 0.0007	0.0001
Von Bertalanffy	937.04 ± 3.98	0.0001	0.5887 ± 0.0053	0.0001	0.0513 ± 0.0006	0.0001
Brody	982.73 ± 5.34	0.0001	1.0556 ± 0.0063	0.0001	0.0354 ± 0.0005	0.0001

408 <sup>a</sup>b<sub>0</sub> = initial body weight, b<sub>1</sub> = linear regression coefficient, and b<sub>2</sub> = quadratic regression coefficient,  
 409

A = asymptotic mature weight, B = degree of maturity at birth, K = maturing rate

410 **Table 4** Means and SD of differences between predicted and actual body weights by growth period  
 411

Model	Early growth		Late growth		Maturity	
	Mean	SD	Mean	SD	Mean	SD
Quadratic	2.67	71.66	-1.64	75.43	7.53	62.99
Logistic	13.31	84.12	-0.51	76.26	11.84	67.74
Gompertz	-1.50	71.07	-3.59	76.31	7.09	62.32
Von Bertalanffy	0.45	71.07	-4.94	76.45	10.63	63.20
Brody	4.66	71.93	-11.39	76.69	18.06	66.15

412

413

414 **Table 5** Coefficient of regression estimates for the Quadratic model by breed group  
 415

Breed group <sup>a</sup>	Coefficient of regression <sup>b</sup>					
	b <sub>0</sub>	P-value	b <sub>1</sub>	P-value	b <sub>2</sub>	P-value
BG1	38.027 ± 5.159	0.0001	24.586 ± 0.289	0.0001	-0.174 ± 0.003	0.0001
BG2	38.481 ± 5.645	0.0001	24.956 ± 0.307	0.0001	-0.175 ± 0.003	0.0001
BG3	34.495 ± 11.024	0.0018	22.574 ± 0.549	0.0001	-0.143 ± 0.005	0.0001
BG4	23.923 ± 8.661	0.0059	24.538 ± 0.470	0.0001	-0.174 ± 0.004	0.0001

416 <sup>a</sup> BG1 = 0.96 ≤ H < 1.00, BG2 = 0.91 ≤ H < 0.96, BG3 = 0.86 ≤ H < 0.91, and BG4 = 0.44 ≤ H < 0.86

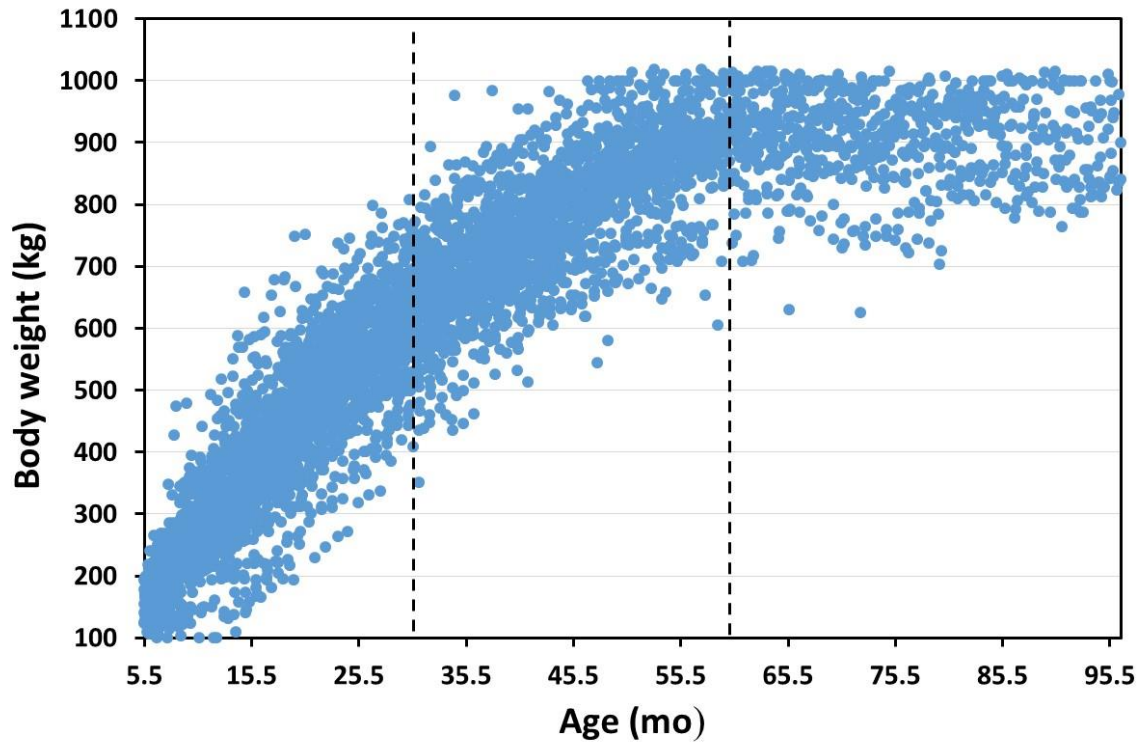
417 <sup>b</sup> b<sub>0</sub> = initial body weight, b<sub>1</sub> = linear regression coefficient, and b<sub>2</sub> = quadratic regression coefficient

418

419 **Table 6** Means and SD of differences between predicted weights with the Quadratic model  
 420 and actual weights in each growth period by breed group and total  
 421

Breed group <sup>a</sup>	Early growth		Late growth		Maturity	
	Means	SD	Means	SD	Means	SD
BG1	-1.97	71.39	-1.39	74.98	17.70	72.89
BG2	-6.28	58.27	-19.55	67.61	-5.71	49.01
BG3	23.78	99.57	27.47	83.45	-14.60	50.44
BG4	15.94	57.38	-3.48	68.13	38.44	60.69
Total	2.68	71.66	-1.64	75.43	7.53	62.98

422 <sup>a</sup> BG1 = 0.96 ≤ H < 1.00, BG2 = 0.91 ≤ H < 0.96, BG3 = 0.86 ≤ H < 0.91, and BG4 = 0.44 ≤  
 423 H < 0.86

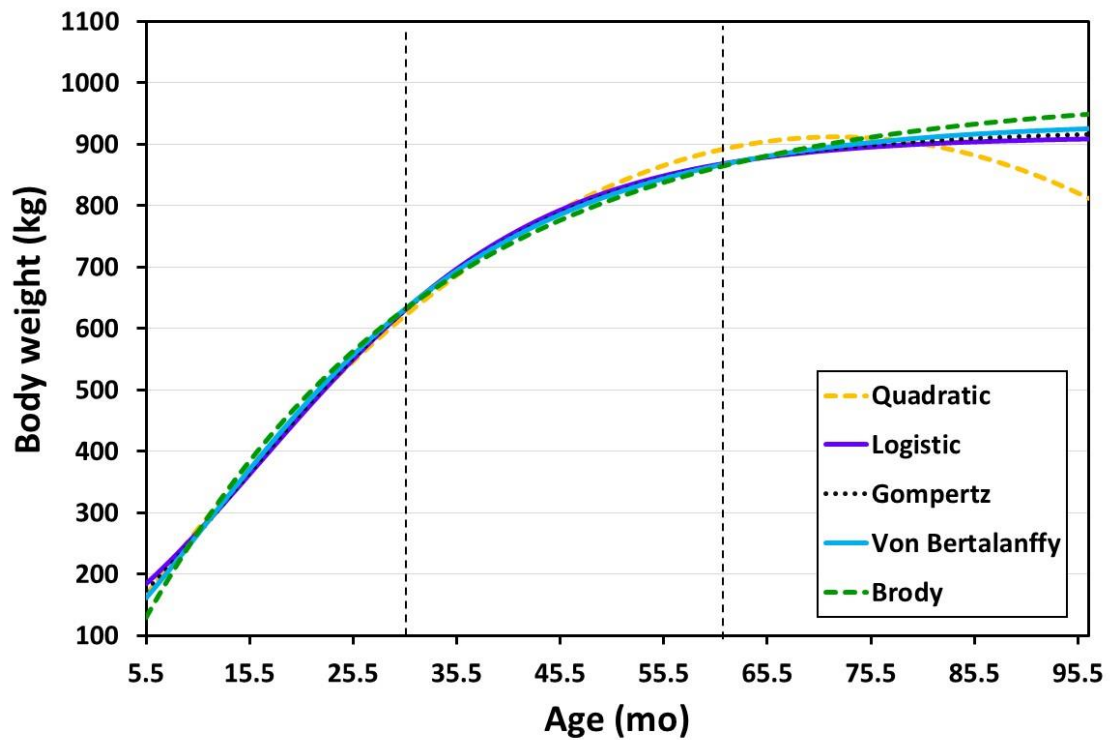


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426 **Fig. 1** Scatter plot of bull weights from 5.5 to 96 months of age

427



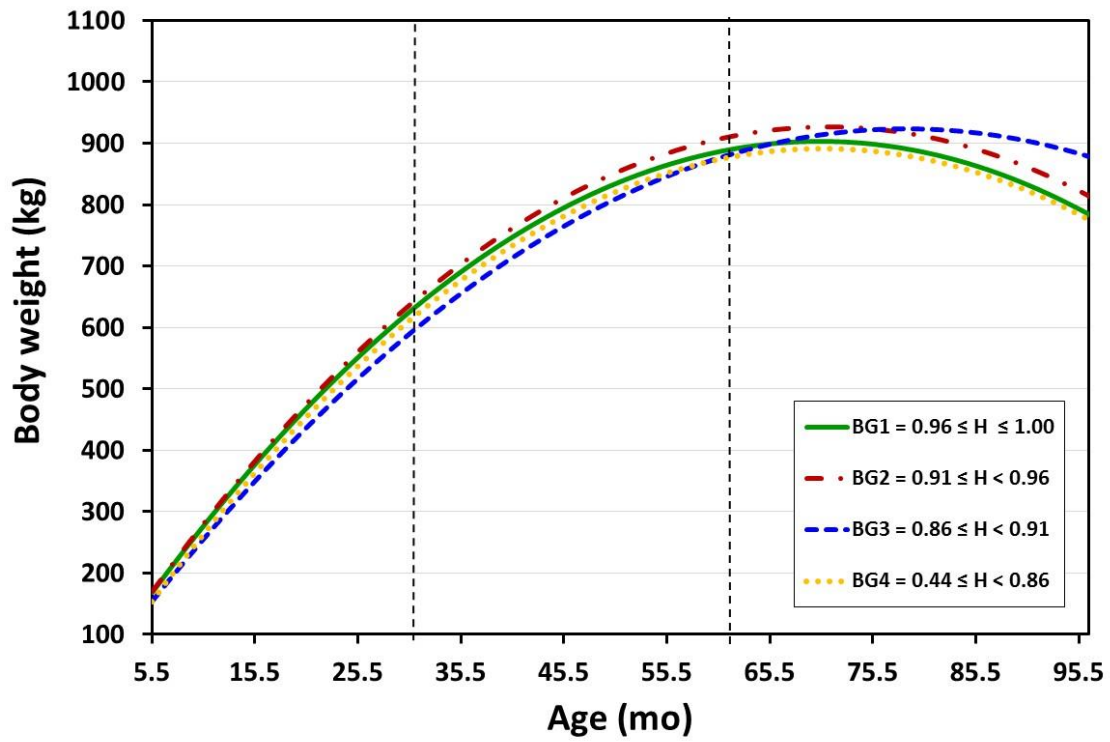
428

429 **Fig. 2** Predicted growth curves between 5.5 and 96 mo of age using five growth models.

430

431





432

433 **Fig. 3** Growth curves per breed group predicted using a Quadratic model.

434