1	Fitting Multiphasic Logistic Functions to the Lactation Curves of Gir x Friesian
2	Crossbred Dairy Cattle in Malaysia
3	(Pemadanan fungsi berbilang fasa kepada lengkung laktasi kacukan lembu tenusu Gir x Friesian di
4	Malaysia)
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6	A. M. Majid ^{1#} , A. A. Shariff ¹ , A. F. Merican ² and Y. B. Bong ³
7	
8	ABSTRACT
9	The data used in this study consisted of milk yield (kg) taken at approximately fortnightly
10	intervals from Gir x Friesian crossbred dairy cattle raised at Institut Haiwan Kluang, Malaysia. The
11	data were first edited, smoothed and then fitted with mono-, di- and triphasic logistic functions. In
12	general, parameter estimates for the first lactation were reasonable. However, for the second lactation
13	the estimates were erratic and unreasonable because this was an atypical lactation for which the
14	multiphasic functions were obviously unsuitable. Residual mean squares for the di- and triphasic
15	functions of the first lactation were very similar (0.0002 and 0.0004, respectively) and smaller than for
16	the monophasic function (0.0894). For the second lactation, residual mean squares for the triphasic
17	function (0.001) was the lowest compared to those for the mono- and diphasic functions (0.0345 and
18	0.0315). For the first lactation, the monophasic function did not fit the data well because it had large
19	residuals. The di- and triphasic functions were almost similar in fitting the lactation and had low
20	residuals. For the second lactation, both the mono- and diphasic functions did not fit the data very
21	well and had rather large residuals. The triphasic function was the most fitting and had small
22	residuals. Derived functions were generally lower for the first lactation than for the second lactation:
23	initial milk yields (4.88 to 6.0 kg versus 9.9 to 11.8 kg); peak milk yields (5.8 to 9.6 kg versus 12.8 to
24	15.7 kg) and 305-day milk yields (1147.7 to 1328.6 kg versus 1687.4 to 2296.1 kg).
25	
26	Keywords: Lactation; Gir x Friesian crossbred cattle; Multiphasic logistic functions; Milk yield
27	

ABSTRAK

Data hasil susu (kg) yang diguna dalam kajian ini telah ditimbang lebih kurang setiap dua minggu 31 32 daripada lembu kacukan tenusu Gir x Friesian yang diternak di Institut Haiwan Kluang, Malaysia. Data ini terlebih dahulu disunting dan dilicinkan sebelum dipadankan dengan fungsi logistik mono-, 33 dwi- dan trifasa. Secara am, aggaran parameter untuk laktasi pertama adalah munasabah. Tetapi, 34 35 anggaran untuk laktasi kedua adalah tidak menentu dan tidak munasabah kerana laktasi ini luar 36 biasa dan fungsi logistik tidak sesuai dipadankan kepadanya. Min kuasa dua ralat untuk fungsi dwi-37 dan trifasa bagi laktasi pertama adalah hampir sama (0.0002 dan 0.0004) dan lebih kecil daripada fungsi monofasa (0.0894). Bagi laktasi kedua, min kuasa dua ralat untuk fungsi trifasa (0.001) adalah 38 39 paling rendah jika dibandingkan dengan fungsi mono- dan dwifasa (0.0345 dan 0.0315). Bagi laktasi 40 pertama, fungsi monofasa tidak padan pada data dengan baik kerana ia mempunyai ralat yang besar. 41 Fungsi dwi- dan trifasa adalah hampir sama padan untuk laktasi ini dan mempunyai ralat yang 42 rendah. Bagi laktasi kedua, fungsi mono- dan dwifasa tidak padan pada data dengan baik dan 43 mempunyai ralat yang besar. Fungsi trifasa adalah yang paling padan dan mempunyai ralat yang 44 rendah. Secara am, fungsi-fungsi terbitan adalah lebih rendah bagi laktasi pertama daripada laktasi 45 kedua: hasil susu awal (4.88 hingga 6.0 kg berbanding 9.9 hingga 11.8 kg); hasil susu kemuncak (5.8 hingga 9.6 kg bebanding 12.8 hingga 15.7 kg) dan hasil susu 305 hari (1147.7 hingga 1328.6 kg 46 47 berbanding 1687.4 hingga 2296.1 kg).

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49 *Kata kunci: Laktasi, kacukan lembu Gir x Friesian, fungsi pelbagai fasa logistik, hasil susu.*

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INTRODUCTION

In Malaysia, crossbreeding of dairy cattle between *Bos taurus* and *B. indicus* breeds started as early as the 1930s (Sivarajasingam 1975). At that time, however, there was no organized breeding programme. It was only in 1963 that crossbreeding between the two sub-species became organized (Wan Hassan 1990). Another milestone in dairy production in Malaysia occurred in 1974 when the Department of Veterinary Services started importing foreign breeds from New Zealand and Australia. 57 One of the crossbreds formed in Malaysia was between the Gir (*B. indicus*) and the Friesian (*B. taurus*) breeds.

59 Over the years, various mathematical functions have been fitted to lactations. The most common is the 60 incomplete gamma function used by Wood (1967, 1968, 1969, 1976, 1980), Rao and Sundaresan 61 (1979), Ferris et al. (1985), Varona et al. (1998) and Nur Farydah (2002). Polynomial regression 62 equations have also been used for dairy cattle (McCraw & Butcher 1976) and dairy goats (Majid 63 1985).

The multiphasic logistic function is an example of an empirical or functional model which is characterized by having less parameters and easier to handle mathematically than models that are mechanistic (Steri 2009). This function was first developed by Koops (1986) to study the growth of animals and man. Differentiating this function with respect to time yielded the multiphasic logistic functions presently used to model lactation curves. Its application to dairy cattle lactations was first introduced by Grossman and Koops (1988). Gipson and Grossman (1989) then applied it to dairy goat lactation.

In Malaysia, the fitting of lactation curves with multiphasic logistic functions was first performed by Farah (2004) and Faridah (2004) but they were only successful with the monophasic function. This was followed by Hairun Nisa (2007) and Suhaili (2007) who were partially successful in fitting up to the triphasic function. The present study hopes to improve on the work of the previous researchers.

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MATERIALS AND METHODS

78 Lactation Data

The data used in this study were collected from crossbred Gir x Friesian dairy cattle raised at Institut Haiwan, Kluang, Malaysia. The data were stored in the record-keeping software system called DairyCHAMP 1.1 (Dairy Computerized Health and Management Programme). Among the information contained in the system were breed of cow, identification number, date of birth of dam, paternal breed, maternal breed, lactation number, date of test, test milk weight, maximum milk yield, expected milk yield, expected 305-day milk yield, dry-off date and lactation length. The data consisted
of milk yield (kg) taken at approximately fortnightly intervals.

The available data were first edited before being subjected to statistical analysis. Some records were omitted from the data set for the following reasons: unknown genotype, unknown parental breed, lactations with less than six milk samples, lactation number greater than six and lactations with records starting more than 35 days in milk.

90 Statistical Analyses

91 Lactations were smoothed using PROC LOESS of the SAS package (SAS 1985). The moving 92 average algorithm of this procedure created a smooth curve in place of the fluctuating mean milk 93 yields of each lactation. Mean milk yields and those obtained by smoothing using PROC LOESS at 20, 40, ..., 280, 300 days are shown in Table 1. The smoothed lactations were then fitted with the 94 multiphasic logistic functions of the form $y_t = \sum \{a_i b_i [1 - tanh^2 (b_i (t - c_i))]\}$, where y_t is milk yield at 95 time t, a_ib_i is peak milk yield, tanh is the hyperbolic tangent, b_i is the lactation parameter at the ith 96 phase, t is days in milk and c_i is time of peak milk yield. The parameters of the equations were 97 98 estimated using PROC NLIN (non-linear procedure) of the SAS package (SAS 1985). The Gauss-99 Newton method was used in parameter estimation and the number of iterations was limited to100.

Derived functions obtained using the estimates were initial yield, peak yield and 305-day yield. Initial yield was estimated as $y_t = \sum \{a_i b_i [1 - tanh^2 (b_i (t - c_i))]\}$ with t=0, peak yield as $a_i b_i$ and 305-day yield as $MY_{305} = \sum \{a_i [tanh(b_i(305 - c_i)) - tanh(b_i(0 - c_i))]\}$.

103 Residual values, which is the difference between the predicted and mean smoothed values, were104 used as a measure of goodness-of-fit of the multiphasic models.

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RESULTS AND DISCUSSION

Figures 1(a), 1(b) and 1(c) show that the first lactation had a standard lactation curve characterized by an initial low value, increasing towards peak milk yield and finally declining gradually towards the end of lactation. However, as indicated by Figures 3(a), 3(b) and 3(c), the second lactation was an atypical lactation that had no inclining phase, no peak and had only the declining phase. Atypical lactation curves have been observed in cattle (Congelton & Everett 1981; Shanks et al. 1981), sheep (Cappio-Borlino et al. 1997) and goats (Macciotta et al. 2008). The absence
of a peak in such lactations can be ascribed to either the peak occurring before parturition or too soon
after parturition such that the first milk yield was recorded after the peak.

115 Mean squares from analyses of variance for the first and second lactations of Gir x Friesian 116 cattle are shown in Table 2. The effect of the fitted model in the mono-, di- and triphasic functions 117 were all significant (p<0.01). In both lactations, the triphasic function had the lowest mean squares for 118 the residual effect, indicating that it is the most suitable for fitting both lactations.

The parameter estimates for the first and second lactations are shown in Table 3. The estimates for the mono-, di- and triphasic functions of the first lactation were reasonable and all had positive values. However, the estimates for the second lactation were erratic and unreasonable. This must be due to the fact that it is an atypical lactation without an increasing phase and a peak. Some of the estimates had negative values, indicating that the multiphasic function may not be suitable for fitting atypical lactations. Similar changes in the sign of the estimates for atypical lactations have also been described by Macciotta et al. (2008).

126 Figures 1(a), 1(b) and 1(c) show the smoothed curve of the first lactation fitted with mono-, diand triphasic functions, respectively. The monophasic function had no peak and did not fit the curve 127 128 well at several phases of the lactation (Figure 1(a)). Residual values in Figure 2 show that it tended to 129 underpredict milk yield from 20 through 40 days, overpredict from 40 through 130 days, underpredict 130 again from 130 through 240 days and finally overpredict from 240 through 300 days. The diphasic and 131 triphasic functions (Figures 1(b) and 1(c)) both fitted the curve well. The residual values for both 132 functions were low and very similar to each other, implying that at least for this particular lactation, 133 the diphasic function was just as good as the triphasic function.

Figures 3(a), 3(b) and 3(c) show the smoothed curve of the second lactation fitted with mono-, di- and triphasic functions, respectively. The triphasic function fitted the lactation best and had the lowest residual values which were fairly randomly distributed (Figure 4). The mono- and diphasic functions did not fit the lactation as well as the triphasic function and had larger residuals. The monophasic function tended to overpredict milk yield in the initial phase of the lactation, underpredict from 40 through 110 days, overpredict from 110 through 200 days, underpredict from 200 through 280 days and finally overpredict from 280 days to the end of the lactation. The diphasic function predicted
milk yield quite closely up to 60 days, underpredicted from 60 through 100 days and then followed
closely the pattern showed by the monophasic function.

Derived functions calculated from the parameter estimates were initial yield, peak milk yield 143 and 305-day yield (Table 4). Initial yields for the first lactation were estimated from 4.88 to almost 6 144 kg and were lower than between 9.9 and 11.8 kg estimated for the second lactation. Peak milk yields 145 146 for the first lactation were estimated at between 5.8 to 9.6 kg; estimates for the second lactation were higher and ranged from 12.8 to 15.7 kg. It must be cautioned that the second lactation had no peak so 147 the estimated peak must be a theoretical value that occurred before the start of lactation. 305-day milk 148 yield estimates for the first lactation were from 1147.7 to 1328.6 kg and for the second lactation from 149 1687.4 to 2296.1 kg. 150

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CONCLUSIONS

153 In the present study, the first lactation represents a standard lactation with an ascending phase, a peak and a decreasing phase while the second lactation represents an atypical lactation with no 154 ascending phase, no peak and only a descending phase. Due to the nature of the multiphasic logistic 155 functions, the estimates of parameters were more logical for the first lactation. The estimates for the 156 157 second lactation, however, were erratic and unreasonable. As a result, the functions tended to fit the 158 first better than the second lactation. For the first lactation, based on the fitted curve and the residuals, the diphasic function was almost as good as the triphasic function. However, for the second lactation, 159 it was necessary to fit the triphasic function as the diphasic function had large residuals. 160

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167	REFERENCES
168	Cappio-Borlino, A., Macciotta, N. P. P. & Pulina, G., 1997. The shape of Sarda ewe lactation curve
169	analyzed with a compartmental model. Livest. Prod. Sci. 51, 89-96.
170	Congleton, W. R. & Everett, R. W., 1980. Error and bias of the incomplete gamma function to
171	lactation curves. J. Dairy Sci. 63, 101-108.
172	Farah, S. M. M., 2004. Use of the multiphasic logistic function in lactation curves of Sahiwal x
173	Friesian dairy cattle. B.Sc.Thesis, Universiti Kebangsaan Malaysia, Bangi, Malaysia.
174	Faridah, I., 2004. Use of the multiphasic function to fit the lactation curve of Girlando cattle.
175	B.Sc.Thesis, Universiti Kebangsaan Malaysia, Bangi, Malaysia.
176	Ferris, T. A., Mao, I. L. & Anderson, C. R., 1985. Selecting for lactation curve and milk yield.
177	J. Dairy Sci. 68, 1438-1448.
178	Gipson, T. A. & Grossman, M., 1989. Diphasic analysis of lactation curves in dairy goats.
179	J. Dairy Sci. 72, 1035–1044.
180	Grossman, M. & Koops, W. J., 1988. Multiphasic analysis of lactation curves in dairy cattle.
181	J. Dairy Sci. 71, 1598–1608.
182	Hairun Nisa, A. H., 2007. Fitting of the mutiphasic logistic function to the lactations of Sahiwal x
183	Friesian crossbred dairy cattle. B.Sc.Thesis, University of Malaya, Kuala Lumpur, Malaysia.
184	Koops, W. J., 1986. Multiphasic growth curve analysis. Growth 50, 169-177.
185	Majid, A. M., 1985. Characterization of five breeds of dairy goats. Ph.D. Thesis, Texas A&M
186	University, College Station.
187	Macciotta, N. P. P., Dimauro, C., Steri, R. & Cappio-Borlino, A., 2008. Mathematical modelling of
188	Goat Lactation Curves. In: Cannas, A. & Pulina, G. (eds), Dairy Goats Feeding and Nutrition,
189	pp. 31-46. CAB International, Wallingford, UK.
190	McCraw, R. & Butcher, K. R., 1976. Lactation curves for calculating persistency. North Carolina Agr.
191	Ext. Serv. Letter No. 12.
192	Rao, M. K. & Sundaresan D., 1979. Influence of environment and heredity on the shape of lactation
193	curves in Sahiwal cows. J. Agr. Sci. (Camb.) 92, 393.

REFERENCES

- SAS, 1985. Statistical Analysis System User's Guide: Statistics: Version 5. SAS Institute Inc., Cary,
 North Carolina.
- Shanks, R., Berger, P. J. & Freeman, A. E., 1981. Genetic aspects of lactation curves. J. Dairy Sci. 64,
 1852-1860.
- Sivarajasingam, S., 1975. The genetic potential of LID cattle. In: Symposium on Bridging the Dairy
 Gap. Bulletin 140, pp. 57-64. Ministry of Agriculture and Rural Development, Malaysia.
- Steri, R., 2009. The mathematical description of the lactation curve of Ruminants: issues and
 Perspectives. Tesi di Dottorato in Scienze dei Sistemi Agrari e Forestali e del l e Produzioni
 Alimentari Indirizzo Scienze e Tecnologie Zootecniche, Università Degli Studi Di Sassari.
- 203 Suhaili, M. Y., 2007. Fitting of the multiphasic logistic functions to the lactations of Girlando cattle.
- 204 B.Sc. Thesis, University of Malaya, Kuala Lumpur, Malaysia.
- 205 Wan Hassan, W. E., 1990. Pengeluaran Tenusu di Malaysia. Dewan Bahasa dan Pustaka, Kuala
 206 Lumpur, Malaysia.
- 207 Wood, P. D. P., 1967. Algebraic model of the lactation curve in cattle. Nature (Lond.) 216, 164-165.
- 208 Wood, P. D. P., 1968. Factors affecting persistency of cattle in lactation. Nature (Lond.) 218, 894.
- Wood, P. D. P., 1969. Factors affecting the shape of the lactation curve in cattle. J. Anim. Prod. 11(3),
 307-316.
- Wood, P. D. P., 1976. Algebraic models of the lactation curves for milk, fat and protein production,
 with estimates of seasonal variation. J. Anm. Prod. 22, 35-40.
- Wood, P. D. P., 1980. Breed variation in the shape of the lactation curve of cattle and their
 implications for efficiency. J. Anim. Prod. 31, 133-141.
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Table 1. Mean milk weights and smoothed values obtained by using PROC LOESS of SAS
 for Gir x Friesian lactations¹.

Days	1 st La	ctation	2 nd Lactation		
in milk	Mean (kg) Smoothed (kg)		Mean (kg)	Smoothed (kg)	
20	5.10	5.31	10.10	9.59	
40	6.10	5.84	8.20	8.95	
60	6.40	6.13	8.30	8.46	
80	6.20	6.21	8.20	8.10	
100	6.00	6.03	8.00	7.93	
120	5.70	5.68	7.80	7.73	
140	5.30	5.34	7.40	7.47	
160	5.00	5.02	7.00	7.21	
180	4.90	4.79	7.10	6.85	
200	4.40	4.69	6.60	6.39	
220	4.80	4.64	5.70	5.90	
240	4.80	4.57	5.30	5.56	
260	4.40	4.45	5.30	5.32	
280	4.40	4.29	5.40	5.19	
300	4.00	4.08	5.10	5.18	

¹Number of lactations involved are 17 and 12 for the first and second lactations, respectively.

Table 2. Mean squares from analyses of variance for monophasic, diphasic and triphasicfunctions for the first and second lactations of Gir x Friesian cattle.

Source of							
Variation	$d.f.^1$		1 st Lactation			2 nd Lactation	
		Monophasic	Diphasic	Triphasic	Monophasic	Diphasic	Triphasic
		-	-	_	-	-	-
Model	a	134.0000**	67.1706**	44.7807**	258.3000**	129.2000**	86.1582**
Residual	b	0.0894	0.0004	0.0002	0.0345	0.0315	0.0010

¹Degrees of freedom for Model and Residual are, respectively, 3 and 12 for monophasic, 6
 and 9 for diphasic and 9 and 6 for triphasic.

** p<0.01.

Table 3. Parameter estimates (± standard errors) of the monophasic, diphasic and triphasic
 functions for the first and second lactations of Gir x Friesian cattle.

		1 st Lactation			2 nd Lactation	
Parameters	Monophasic	Diphasic	Triphasic	Monophasic	Diphasic	Triphasic
al	2418.70 ± 547.40	620.50 ± 29.81	232.30 ± 90.72	9310.40 ± 6034.90	29.96 ± 393.30	-791.40 ± 211.40
b1	0.0024 ± 0.0005	0.0086 ± 0.0002	0.012 ± 0.001	0.0016 ± 0.0003	0.20 ± 0.92	0.009 ± 0.001
c1	29.00 ± 52.59	58.56 ± 1.27	84.01 ± 8.27	-420.70 ± 317.10	28.71 ± 6.84	51.30 ± 9.54
a2		585.30 ± 39.46	811.00 ± 80.32		4415.90 ± 1248.30	3185.80 ± 473.1
b2		0.0066 ± 0.0004	0.0053 ± 0.0005		0.0022 ± 0.0004	0.0051 ± 0.0007
c2		272.40 ± 2.33	250.00 ± 7.77		-100.70 ± 99.88	20.07 ± 20.37
a3			194.70 ± 61.93		,	304.30 ± 199.00
b3			0.013 ± 0.002			0.012 ± 0.003
c3			13.27 ± 10.76			363.10 ± 31.94

				Derived f			
Phase		Initial yield ¹ (kg)		Peak yield ² (kg)		305-day yield ³ (kg)	
			1^{st} Lact. 2^{nd} Lact.		1^{st} Lact. 2^{nd} Lact.		2 nd Lact.
Monophasi	c						
	1	4.88	9.89	5.80	14.89	1233.54	1689.83
Diphasic							
-	1	3.98	2.53	5.34	5.99	577.06	44.04
	2	1.97	9.24	3.86	9.71	570.67	2252.10
	Total	5.95	11.77	9.20	15.70	1147.73	2296.14
Triphasic							
-	1	1.42	-5.93	2.79	-7.12	353.09	-925.94
	2	2.19	16.08	4.30	16.25	793.97	2546.64
	3	2.09	1.54	2.53	3.65	181.55	48.69
	Total	5.70	11.71	9.62	12.78	1328.61	1687.39

Table 4. Functions derived from parameter estimates for the first and second lactations of Gir x Friesian cattle.

¹Estimated from $y_t = \sum \{a_i b_i [1 - tanh^2 (b_i (t - c_i))]\}$ with t=0. ²Estimated from $a_i b_i$.

³Estimated from MY₃₀₅ = $\sum \{a_i [tanh(b_i(305 - c_i)) - tanh(b_i(0 - c_i))]\}$.

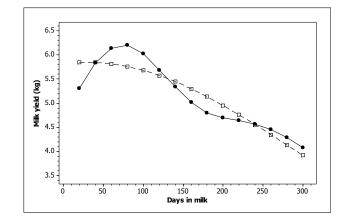
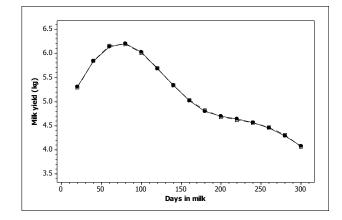


Figure 1(a). First lactation of Gir x Friesian cattle fitted with monophasic logistic function
(• smoothed, □ predicted).



302 Figure 1(b). First lactation of Gir x Friesian cattle fitted with diphasic logistic function

303 (• smoothed, \Box predicted).

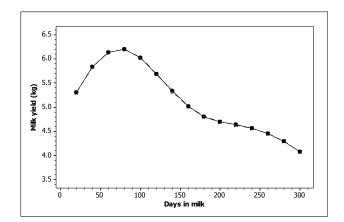


Figure 1(c). First lactation of Gir x Friesian cattle fitted with triphasic logistic function
(● smoothed, □ predicted).

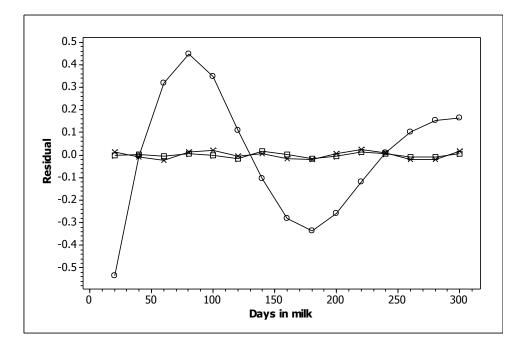


Figure 2. Residual values for the first lactation of Gir x Friesian cattle fitted with monophasic
(○), diphasic (×) and triphasic (□) logistic functions.

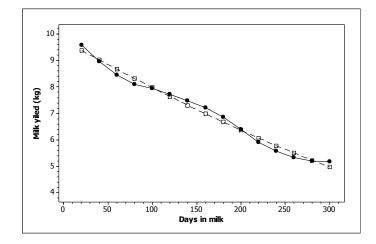


Figure 3(a). Second lactation of Gir x Friesian cattle fitted with monophasic logistic function

- 333 (• smoothed, \Box predicted).

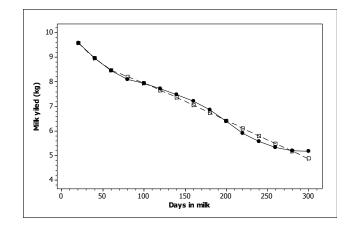


Figure 3(b). Second lactation of Gir x Friesian cattle fitted with diphasic logistic function (\bullet smoothed, \Box predicted).

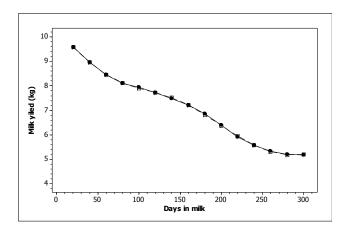


Figure 3(c). Second lactation of Gir x Friesian cattle fitted with triphasic logistic function
(● smoothed, □ predicted).

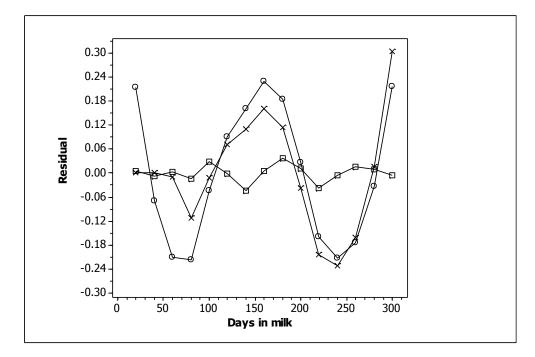


Figure 4. Residual values for the second lactation of Gir x Friesian cattle fitted with
monophasic (○), diphasic (×) and triphasic (□) logistic functions.

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