

Estimation of sustained peak yield interval of dairy cattle lactation curves using a broken-line regression approach

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Abstract

A broken-line regression model with three straight lines and two breakpoints was used to estimate the sustained peak yield of the lactation curve. A sample of 1548 lactation records of 425 Holstein-Friesian cows was provided by the Research and Application Farm of the Agriculture Faculty of Çukurova University in Adana, Turkey. A total of 13463 test-day milk yields (kg/day), recorded once a month with electronic identification and automatic milking recording systems, between November 1994 and January 2006, were used. The data was classified as first, second, third, fourth, fifth, sixth and seventh parity, and included 4105, 3238, 2495, 1800, 1113, 641 and 71 test-day records, respectively. Times (days) at the beginning and end of sustained peak yield per parity were 73.9 - 160.2, 70.6 - 131.9, 70.8 - 130.7, 71.0 - 130.3, 71.3 - 130.4, 71.2 - 128.2 and 71.1 - 129.8, respectively. The peak yields of lactation curves were 19.1 kg/d, 21.8 kg/d, 23.8 kg/d, 24.2 kg/d, 24.4 kg/d and 21.3 kg/d, and days in milk (DIM) at peak yields of lactation curves per parity were 126, 103, 102, 104, 106, 103 and 104, respectively. Persistency values (days) and total lactation milk yields (kg/lactation) per parity were 86.4, 61.3, 59.9, 59.3, 59.1, 57.0, 58.7 and 4852.2, 5105.7, 5503.5, 5503.7, 5449.3, 5416.3, 4802.4, respectively. Results showed that the first parity had a lactation curve with the lowest milk yield at peak that reached the peak point at the latest time (DIM) after parturition, but the largest interval between the beginning and end of the sustained peak yield among all parities. This means that the cows in the first lactation were more persistent than those in the later lactations.

Keywords: Sustained peak yield interval, breakpoint estimation, lactation curve, persistency

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Introduction

A lactation curve, namely the variation in milk production during lactation, represents the relationship between milk yield and time after parturition (Ruvuna *et al.*, 1995). The shape of lactation curves provides a valuable tool for identifying characteristics that best describe superior lactation potential (McGill *et al.*, 2006) and also valuable information about the biological and economic efficiency of the animal or herd under consideration (Grossman & Koops, 1988). The shape of a typical lactation curve may be described as increasing at a high rate up to the first breakpoint (the beginning of Sustained Peak Yield (SPY)), after which the increase in daily milk yield tapers off (almost ceases) abruptly, until the peak production point is obtained. After this it declines at a slower rate until the second breakpoint (the end of SPY), followed by a rapid decrease until the end of the milk production cycle. Milk yield between the first and second breakpoints is constant, and at around that of the peak level of lactation. Thus, the lactation curve can be considered as comprising three linear segments: in the first segment there is an increase from the initial yield at calving to the starting point of SPY, in the second segment is the SPY between the first and second breakpoints, and in the third one there is a decrease from the end of SPY to the end of lactation. The first and second breakpoints are the two points around the peak and indicate the starting point and the endpoint of the time interval over which the high milk production or SPY is obtained in the lactation cycle. The breakpoint and peak values of a lactation curve vary according to biological factors and various environmental factors, such as a cow's age, parity, fertility, feeding, and the calving season (Wood, 1967; Whittemore, 1980; Ferris *et al.*, 1985). Determination of the beginning and end of SPYs of the lactation curve is important to explain the main features of the dairy cattle milk production pattern, such as persistency during lactation, and is useful in directing herd management and extending partial records.

Inconsistent definitions of persistency of lactation yield are used in the literature (Wood, 1967; Lombard, 2006). Grossman *et al.* (1999) define the persistency as the number of days between the beginning

and end of SPY, and present a mathematical model that includes a measure of persistency to describe the lactation curve. In this model there are straight lines with different slopes, which intersect, and there is a continuous transition from one slope to the next. They stated that the cows are persistent if they tend to maintain their peak yield within a lactation period. A cow with a flatter lactation curve is therefore considered to be more persistent than a cow with the same total yield but with a curve that decreases abruptly after the peak. Therefore, the persistency of lactation yield is an important element of total yield and significantly affected by parity, season of calving and level of total production (Sölkner & Fuchs, 1987; Gipson & Grossman, 1990; Ruvuna *et al.*, 1995).

The aim of this study was to estimate the interval between the beginning (R_1) and end (R_2) of SPY of the lactation curves by using a breakpoint estimation procedure, using a broken-line regression technique, for use in the estimation of measures of persistency of the lactation curves.

Materials and Methods

A sample of 1548 lactation records of 425 Holstein-Friesian cows were provided by the Research and Application Farm of the Agricultural Faculty of Çukurova University, Adana, Turkey. A total of 13463 test-day milk yields (kg/day), recorded once a month with electronic identification and automatic milking recording systems between November 1994 and January 2006, was used. Data included the cow's identification number, calving date, the parity, the test-day date, the test-day milk yield (kg), and the number of times the cow was milked per day. The data were classified according to parity and days in milk (DIM) and results tabulated in Table 1. Means of daily milk yield according to parity are given in Figure 1(h).

Various mathematical functions were used to describe lactation curves. The incomplete gamma function (IG) and its variants proved relatively powerful in terms of fitting observed daily yields (Wood, 1967; Scott *et al.*, 1996; Tekerli *et al.*, 2000; Vargas *et al.*, 2000; Sahinler & Karakok, 2008). The gamma function, called the Wood model, proved to be relatively powerful and one of the most popular models in fitting observed daily yields. Observed daily milk was presented as:

$$Y_t = aX^b e^{-cX} \quad (1)$$

where: Y_t is the observed milk yield at day t ; a is linked to milk yield at the beginning of lactation, b to the ascending phase before peak yield, and c to the decreasing phase after peak yield.

Three straight lines with two breakpoint broken-line regression models were used to estimate the breakpoints of the lactation curve:

$$\begin{aligned} Y &= L + UX, X < R_1 \\ Y &= L + UR_1 + V(X - R_1), R_1 < X < R_2 \\ Y &= L + UR_1 + V(R_2 - R_1) + W(X - R_2), X > R_2 \end{aligned} \quad (2)$$

where: L is a constant, U is the slope of the line until the first breakpoint, R_1 is the first breakpoint, V is the slope of the line between the first and second breakpoints, R_2 is the second breakpoint, and W is the slope of the line after the second breakpoint (Vito, 2003).

Persistency for lactation yield (P) was calculated as:

$$P = R_2 - R_1 \quad (3)$$

where: R_1 and R_2 are the first and second breakpoints of the lactation curve, P is a measure of persistency and indicates the number of days between the beginning (R_1) and end (R_2) of SPY (Grossman *et al.*, 1999).

Peak yield and DIM at peak yield (DIMP) were calculated as:

$$a(b/c)^b e^{-b} \text{ and } (b/c), \text{ respectively (Wood, 1967; Rekik } et al., 2003).$$

Table 1 Average of test-day milk yield (kg/day) and number of test-day milk yield records (n) according to parity in 425 Holstein-Friesian cows

DIM	Parity													
	1		2		3		4		5		6		7	
	Mean ± s.e.	n	Mean ± s.e.	n	Mean ± s.e.	n								
30	10.4 ± 1.3	304	12.2 ± 2.2	278	13.0 ± 3.3	209	12.2 ± 3.1	158	11.3 ± 3.6	93	11.9 ± 3.5	48	10.4 ± 3.1	30
60	18.2 ± 1.1	419	22.7 ± 2.6	350	24.6 ± 3.3	267	24.8 ± 4.5	202	24.6 ± 4.7	128	24.1 ± 5.3	71	21.9 ± 5.1	44
90	19.1 ± 1.1	417	22.1 ± 2.7	345	24.4 ± 3.3	264	25.0 ± 5.2	198	24.9 ± 4.3	122	25.5 ± 5.4	69	21.6 ± 5.2	44
120	18.8 ± 1.0	410	20.9 ± 2.3	337	22.8 ± 3.2	263	23.2 ± 4.7	193	23.0 ± 4.9	119	23.6 ± 5.3	68	20.8 ± 6.1	40
150	18.2 ± 0.9	406	19.4 ± 2.1	332	20.8 ± 2.7	259	21.5 ± 4.0	188	21.4 ± 4.1	115	21.6 ± 5.0	66	18.1 ± 5.3	38
180	17.5 ± 0.9	401	18.0 ± 1.7	322	19.4 ± 2.5	252	19.5 ± 3.2	181	19.3 ± 4.3	113	18.6 ± 4.2	65	16.8 ± 5.8	36
210	16.7 ± 0.8	393	16.0 ± 1.5	317	17.7 ± 2.0	245	17.4 ± 2.7	175	17.7 ± 3.1	106	17.4 ± 4.1	61	15.8 ± 4.6	32
240	15.8 ± 0.9	385	14.6 ± 1.2	305	15.5 ± 2.0	239	15.5 ± 2.4	165	15.8 ± 3.3	101	15.0 ± 3.7	60	14.1 ± 4.0	29
270	14.8 ± 0.9	372	13.2 ± 1.1	282	13.7 ± 1.7	215	13.3 ± 2.1	146	13.6 ± 2.6	94	12.7 ± 3.7	56	10.8 ± 3.0	26
300	13.8 ± 1.0	340	11.4 ± 1.2	229	11.7 ± 1.9	180	11.9 ± 1.7	116	11.4 ± 2.1	76	11.1 ± 2.5	45	09.9 ± 4.4	17
330	12.6 ± 1.2	258	10.3 ± 1.4	141	11.1 ± 2.2	102	11.1 ± 2.2	78	10.0 ± 1.9	46	09.9 ± 2.4	32	09.5 ± 4.1	8

DIM – Days in milk.

The parameter estimations of the Wood model were made, using the SPSS 13.0 for Windows, breakpoint estimations were made, using the NLIN procedure of SAS system V7 (Sahinler & Sener, 2007), aiming to minimize the residual sum of squares by using the Gauss-Newton iteration method. Graphs of the models were plotted using GraphPad Prism trial version 4.03.

Results and Discussion

The Wood model in equation 1 was fitted to data, and the parameter estimates, peak production and DIM for parities are given in Table 2. In this table the R^2 value is the proportion of explained variance in the data set from the Wood model.

Table 2 Wood model parameter estimates, peak, days in milk (DIM) at peak production and R^2 values for parities

Parity	Parameters			Peak	DIM at peak	R^2
	<i>a</i>	<i>b</i>	<i>c</i>			
1	1.3110	0.6974	0.005518	19.07	126	0.902
2	1.1780	0.8035	0.007836	21.77	103	0.914
3	1.1010	0.8474	0.008295	23.79	102	0.919
4	0.8256	0.9268	0.008926	24.15	104	0.913
5	0.6148	1.0030	0.009477	24.20	106	0.916
6	0.5867	1.0250	0.009917	24.43	103	0.938
7	0.6418	0.9610	0.009256	21.27	104	0.903

a is linked to milk yield at the beginning of lactation;
b - the ascending phase before peak yield;
c - the decreasing phase after peak yield.

Table 2 shows that the R^2 value ranged from 0.902 to 0.938. The regression was significant ($P < 0.01$) and therefore the fit of the Wood model was considered good in all parities. The peak was predicted as 19.1 kg/d, and occurred at 126 DIM for the first parity. For other parities, the peaks were 21.8 kg/d, 23.8 kg/d, 24.2 kg/d, 24.4 kg/d and 21.3 kg/d, which were reached at 103 DIM, 102 DIM, 104 DIM, 106 DIM, 103 DIM and 104 DIM, respectively. Total lactation milk yields (kg/lactation) per parity were 4852, 5106, 5504, 5504, 5449, 5416 and 4802, respectively. Lactation curve characteristics in Table 2 show that the cows in the first lactation reached their peak of production the latest (126 DIM), but had lower peak levels (19.1 kg/d) than in later lactations. The peak yields were greater (21.8 - 24.4 kg/d) and DIMs at peak were lower (102 - 104 DIM) for the cows in the later lactations than the cows in the first lactation. The highest peak was obtained from the cows in the 6th lactation while it was similar in the 4th and 5th lactations. Cows in their 4th lactation had the highest lactation milk production (5504 kg/lactation) among all parities. These results are similar to the findings of Rekik *et al.* (2003). These authors compared the lactation curve characteristics of primiparous and multiparous cows. Horan *et al.* (2005) also reported that parity has significant effects on lactation curve characteristics.

The expected lactation curve (thin solid line), confidence band of the lactation curve (dotted line) and the expected three straight lines with two breakpoints for all parities are represented in Figure 1(a), 1(b), 1(c), 1(d), 1(e), 1(f), 1(g). Lactation curves in the first and later lactations were clearly and consistently different.

A broken-line regression model with three straight lines with two breakpoints, in Equation 2, was fitted to the expected values of the Wood model and parameter estimations, and summarized statistics given in Table 3.

Table 3 Estimates of model parameters, standard error of estimates and 95% confidence limits (CL) of parameters for the broken-line regression model in Equation 2, and persistency and milk yields (Y_1, Y_2) corresponding to the first and second breakpoints, respectively

Parameters	Parity						
	1	2	3	4	5	6	7
L	7.46	8.88	9.16	8.10	6.89	6.95	6.7
s.e.	0.396	0.307	0.398	0.464	0.506	0.651	0.456
95%CL	6.442 – 8.478	8.100 – 9.660	8.140 – 10.185	6.906 – 9.294	5.589 – 8.191	5.276 – 8.624	5.529 – 7.871
U	0.148	0.181	0.206	0.224	0.238	0.243	0.202
s.e.	0.0084	0.0064	0.0084	0.0098	0.0107	0.0137	0.0096
95%CL	0.127 – 0.169	0.165 – 0.198	0.184 – 0.227	0.199 – 0.249	0.210 – 0.265	0.207 – 0.278	0.178 – 0.227
V	0.008	-0.003	-0.004	-0.001	0.003	-0.002	-0.001
s.e.	0.0042	0.0064	0.0084	0.00979	0.0107	0.0137	0.0096
95%CL	-0.003 – 0.017	-0.019 – 0.014	-0.026 – 0.018	-0.025 – 0.025	-0.024 – 0.031	-0.037 – 0.033	-0.026 – 0.024
W	0.041	0.0623	0.0704	0.0746	0.0767	0.0796	0.0667
s.e.	0.0014	0.0009	0.0011	0.0013	0.0014	0.0018	0.0013
95%CL	0.037 – 0.044	0.060 – 0.065	0.068 – 0.073	0.071 – 0.078	0.073 – 0.080	0.075 – 0.084	0.064 – 0.070
R ₁	73.85	70.6	70.78	71.02	71.31	71.24	71.11
s.e.	2.479	1.664	1.917	2.078	2.172	2.678	2.256
95%CL	67.48 – 80.23	66.32 – 74.87	65.85 – 75.70	65.68 – 76.36	65.73 – 76.89	65.36 – 78.13	65.32 – 76.91
R ₂	160.2	131.9	130.7	130.3	130.4	128.2	129.8
s.e.	5.12	3.75	4.32	4.48	4.52	5.73	4.89
95%CL	147.1 – 173.4	122.3 – 141.6	119.6 – 141.9	118.8 – 141.8	118.8 – 142.1	113.4 – 142.9	117.2 – 142.4
Persistency	86.35	61.3	59.92	59.28	59.09	56.96	58.69
Y ₁	18.39	21.68	23.72	24.03	23.84	24.26	21.06
Y ₂	19.06	21.52	23.48	23.99	24.04	24.15	21.01
SSR	0.1569	0.7259	0.159	1.2407	0.2559	0.424	0.2076
F	445.12**	381.68**	1506.36**	322.57**	1099.56**	734.2**	1039.69**

L - a constant; U - the slope of the line until the first breakpoint; R₁ - the first breakpoint; V - the slope of the line between the first and second break-points; R₂ - the second breakpoint; W - the slope of the line after the second breakpoint (formula of Vito, 2003).
SSR - residual sum of squares of the broken-line regression model; ** - significant at $\alpha = 0.01$.

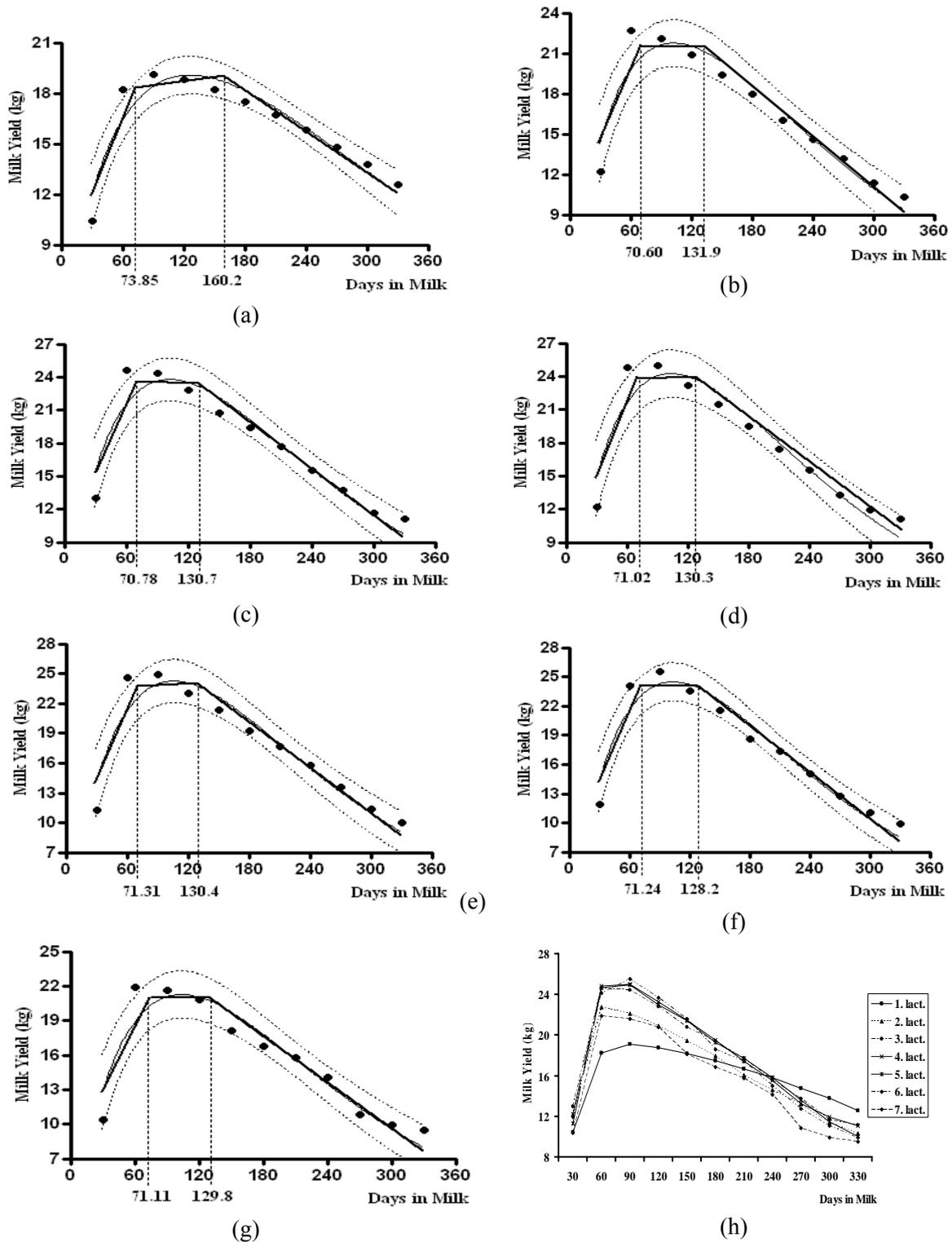


Figure 1 Actual (•) and predicted test-day average milk yields from Wood (thin line) and three intersecting straight lines of a broken-line regression model (bold line), confidence band (dotted line) and the beginning and end time (DIM) of SPY (breakpoints, R_1 , R_2) of the Wood model for (a) 1st lactation, (b) 2nd lactation, (c) 3rd lactation, (d) 4th lactation, (e) 5th lactation, (f) 6th lactation and (g) 7th lactation. Fig. 1(h) shows the daily milk yield according to parity.

The time at transition from increasing to maintain the yield (R_1) of lactation curves was 73.9 DIM, 70.6 DIM, 70.8 DIM, 71.0 DIM, 71.3 DIM, 71.2 DIM and 71.1 DIM for each parity from the first to seventh, respectively. Therefore, these results show that the beginnings of the SPY of the lactation curves from all parities are close to each other. An increase in milk yield continues from initial yield at calving to about the 70th DIM (10th week of lactation). Increasing milk yield after 70 DIM stops abruptly and variation in milk yield continues horizontally at the same level through the second breakpoint, which varies in different parities. Cows in the first lactation have lower milk yields (18.4 kg/d) at the beginning of SPY than cows in later lactations (21.1 - 24.3 kg/d) (Table 3 and Figure 1). However, the rate of increase in daily milk yields was not the same for the different parities.

The time at the end of the SPY, or the beginning of the fast decreasing in milk yield (R_2) of lactation curves, were 160.2 DIM, 131.9 DIM, 130.7 DIM, 130.3 DIM, 130.4 DIM, 128.2 DIM, 129.8 DIM for each parity from the first to seventh, respectively. These results show that the cows in the first lactation reached the end of SPY later (160.2 DIM, *ca.* the 23rd week of lactation) than the others (128.2 - 131.9 DIM, *ca.* 18th week of lactation) (Table 3, Figure 1). In other words, fast decreasing in milk yield after the SPY starts later in first lactation than in the other parities. Cows in the first lactation had lower milk yields at the end of the SPY (19.06 kg/d) than the cows in later lactations (21.0 - 24.2 kg/d) (Table 3, Figure 1).

Persistency measures, defined by Grossman *et al.* (1999) as the number of days for which the level of constant yield is maintained, were calculated by taking differences between the first and second breakpoint values (equation 3) as 86.4 d, 61.3 d, 59.9 d, 59.3 d, 59.1 d, 57.0 d and 58.7 d (Table 3) for the parities, respectively.

It was clear that the cows in the first lactation were more persistent than in the later lactations. The period of SPY was 86.4 d for the cows in the first lactation, which is larger than in the later lactations (57.0 - 61.3 d). However, the level of the SPY in the first lactation was lower than in the later lactations (Table 3). It was found that parity is an important factor which influences the lactation curve characteristics as the persistency measure. Therefore, the milk yield and live weight of the young cows in the first lactation are lower than those in later lactations. So, the young cows may compensate for their lower nutritional requirements longer than the cows in later lactations during the peak of lactation. Similar results have been reported by Rowlands *et al.* (1982), Sölkner & Fuchs (1987), Tekerli *et al.* (2000) and Lombard (2006). It does not mean that the cows in the first lactation have the highest lactation milk yield, because the maintained peak of lactation occurred at a low level. Obtaining a high lactation milk yield is possible in the case of the high persistency at sustained high peak yield level. High persistency does not mean high lactation milk yield because high lactation milk yield depends not only on persistency, but also on the sustained peak yield level.

Conclusions

The first parity has a lactation curve with lowest milk yield and the latest DIM at the beginning of the SPY after parturition but the highest persistency among parities. According to some previous literature, the persistency is defined as the number of days between the beginning and end of the SPY. The broken-line regression technique can be used as a practical approach to calculate persistency easily. The outputs are in agreement with the definition of persistency, although literature does offer different definitions of the persistency measure.

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