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Determining farm effects attributable to the introduction and use of a dairy management information system in The Netherlands

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Abstract

Yearly production and reproduction data on dairy farms in The Netherlands were obtained to determine whether management information systems significantly improved herd performance variables (management information systems (MIS) effects). The analysis included 357 adopters of a management information system and 357 herds were used as controls. The data comprised years 1987 through 1996, and included for the adopters both the 'before' and 'after' period. Panel data analysis enabled to estimate MIS effects both within and between farms, allowing for a separation of farm-specific effects and common (trend) effects. Adoption and use of a management information system resulted in a significant annual increase in rolling herd average milk (carrier) and protein production of 62 and 2.36 kg per cow, respectively. Calving interval was shortened by 5 days. The pay-back period was approximately 5 years of the system (including the hardware), and therefore, MIS appears to be economically profitable. © 2000 Elsevier Science B.V. All rights reserved.

Keywords: Management information system; Panel data analysis; Dairy herds

Abbreviations: MIS, management information system; NRS, Royal Dutch Cattle Syndicate

1. Introduction

Historically, automation of the cow recording system has been one of the first applications in the adoption sequence of new technologies on dairy farms. Dutch dairy farmers have continued to adopt management information systems (MIS). Recent data indicate that approximately 4800 farms, i.e. 15% of the

Dutch dairy farms, now have some type of MIS (ATC, 1996). Automation of the cow recording system offers the ability to improve utilization of individual cow production records in order to support managerial activities and decision making. More recently, advancements in information technology have made it possible to capture additional on-line data, for example, concentrate left-overs recorded by automated concentrate feeders, milk weight and cow activity (Van Asseldonk et al., 1998). However, all of these information technology applications incorporate some kind of automated cow recording system (Schlünsen et al., 1987; Spahr, 1993).

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Although MIS adoption may in itself be an indication of farmers expecting benefits from MIS, it does not provide a quantifiable effect that is attributable to the system (Verstegen et al., 1995b). Several attempts have been made to quantify effects attributable to an MIS on dairy farms. The study by Hayes et al. (1997) was conducted under New Zealand production conditions and covered one complete year. Users achieved an improvement in daily milk production (carrier), fat and protein of 1.2, 0.08, and 0.07 kg, respectively. In addition, a higher percentage (+8.4%) of cows calved during the desired period, which is critical in New Zealand seasonal calving herds, and a higher percentage of cows (+9.7%) mated at the optimal time to achieve a concentrated calving period in the following year. Introduction and use of an MIS was not associated with other commonly used reproductive indices (heat detection efficiency, first service non-return rate and pregnancy rate). According to Hayes et al. (1997) these indices tend to be biased between the two groups (cases and controls) due to differences in the methods and period of recording information and do not so accurately reflect true performance. Losinger and Heinrichs (1996) estimated that dairy operations with an MIS had a significantly higher yearly milk production of 207 kg per cow than non-MIS users. However, adjustments in the statistical model to overcome bias associated with MIS use is hard with this kind of research data (cross-sectional study). Possible differences between the control group and the MIS group before MIS introduction are not available and the suitability of posttest-only designs depends on the comparability of the MIS and control groups before MIS introduction (Verstegen et al., 1995a). Therefore, the reported effects by Losinger and Heinrichs (1996) and Hayes et al. (1997) should be interpreted with care. Lazarus et al. (1990) and Tomaszewski et al. (1997) used time series to quantify MIS benefits, comprising yearly accounting data and milk recording data of 51 and 33 farms, which invested in an MIS during the time period investigated, respectively. The study by Lazarus et al. (1990) estimated a net farm income rise of \$85 per cow in the first year of computer use. Tomaszewski et al. (1997) estimated an increased milk production (carrier) of 421 kg, but none of the investigated reproduction variables were significantly affected. Both studies concerned farms operating in US, i.e. with relatively large dairy herds and without restrictions on milk production. The reported MIS effects may not necessarily be obtained in a situation when an MIS is used in relative small dairy herds such as in The Netherlands. Management could be more depending on some kind of formal MIS when the number of cows increase (time per cow is more restrained) and the amount of recorded data increase. In addition, the marginal value of the (possible) estimated improved milk production per cow is lower under production restrictions (milk quotas).

Overbeek (1992) concluded by means of a cross-sectional research design no effect on gross margins of Dutch dairy farms. As with all cross-sectional studies, this study failed to compare 'before adoption' results with 'after adoption' results within farms, and could not therefore, fully account for the fact that (early) MIS adopters are not a random sample of the population. The purpose of this study is to quantify the benefits of MIS adoption and use in Dutch dairy farming with a unique time series data set; i.e. a so-called panel data set.

2. Materials and methods

Empirical methods to evaluate MIS have been explained by Lazarus et al. (1990) and Verstegen et al. (1995b). For this study, annual production and reproduction variables were obtained for a cross-section of Dutch dairy producers over the time period from 1987 to 1996. Analyzing this kind of data makes it possible to compare at the same time 'before and after' and 'with and without' and hence provides an opportunity to estimate the effect of an MIS adoption on herd performances, eliminating the influence of herd-specific and trend effects. In addition, panel data design makes it possible to estimate technology effects for each year after adoption, clarifying whether the particular technology utilization acts like a trend over several years or occurs as an instant jump at the time of adoption (Mundlak, 1961).

2.1. Study population

The Royal Dutch Cattle Syndicate (NRS) provides herd recording services for Dutch dairy farmers and maintains a historical database on production and other herd specific variables. Yearly production and specific herd data were obtained for all herds in the NRS data set from 1987 through 1996 in order to construct a panel data set. Unique herd numbers of 2607 MIS users and date of initial MIS purchase were identified by four Dutch software developers, together serving almost the entire MIS market in the Dutch dairy sector. In order to obtain a random sample of these herds, the herds were sorted according to purchase date within each software developer. Every fifth herd was selected as an MIS herd to be included in the analysis. These procedures ensured that all developers were proportionally represented within the sample in relation to the number of programs they had sold, as well as the time of introduction of the program. An additional restriction required that herds had to have purchased the MIS in the time period analyzed and had to have data as to the entire range of the study. Of the 521 MIS herds selected, 382 met this requirement.

Despite the vast majority of management automation, the use in current commercial MIS is in the standard version limited to animal production tables, attention lists and working schedules. However, MIS users could have installed additional software, thereby enhancing the functionality of the MIS system.

For the MIS selected herds, the developers provided the unique herd identification number that allowed identification of the herds in the NRS data set. Since other NRS herds could be using some other management software program, which was not known by the NRS, a procedure was developed for selecting control herds that eliminated as many potential MIS users as possible from the NRS database before selecting control herds. Some producers who utilize other data collection programs subscribe to an NRS service that provides a file of their monthly herd recording results, which they then load into their own farm database. Herds that were enrolled on this service were termed electronic data interchange (EDI) herds. It was assumed that these 4283 EDI herds were potential MIS users. Additionally, we were able to identify 485 herds of the 2607 MIS herds that had not been included in the EDI herd list. These 4768 herds were eliminated as potential control herds from the NRS yearly data set, which contains in total about 27 000 herds.

The inclusion of controls in the research design would improve the accuracy of estimation through additional possibilities of correcting for trends not caused by technology use. Since farm size, operator age and education level are important determinants of MIS adoption (Putler and Zilberman, 1988; Batte et al., 1990), MIS herds might not be seen as a random sample but represent bigger farms with above average management levels. However, variables describing management were not recorded (directly) in the database.

To ensure that the control herds were initially similar to the MIS herds, a control herd was selected for each MIS herd according to the following criteria: (1) the herd's major breed had to be the same and the percentage of the breed within the control herd had to be within 5% of the MIS herd; (2) the number of cows in the control herd had to be within 5% of the MIS herd: (3) the differences between the MIS and control herds for fat and protein milk production (FPCM). The control herd that had the most similar initial FPCM was taken as the control herd for the MIS herd. Three MIS herds that failed to match with 1 and 2 were deleted from the analysis. The 379 control herds were reduced to 357 control herds due to the additional requirement that data should be available for 10 consecutive years. The MIS herds that did not have controls were also eliminated resulting in a data set of 357 MIS and 357 control herds. Structuring the data set in this manner ensured that control and MIS herds were similar at the start of the study and ensured that herds had observations before and after MIS adoption. This procedure avoided, to a certain extent, problems of distinguishing between production (i.e. management level) and MIS effects.

2.2. Statistical analysis

Simple descriptive statistics in terms of means and standard deviations were used to explore the differences in herd size and average milk production per cow between adopters and non-adopters. For each period, the category of herds enrolled in an MIS in that year was compared with other herd categories, including: (0) non-MIS herds in the whole period 1987–1996;

- (1) MIS herds that had not installed the system yet;
- (2) MIS enrolment in the current year and (3) having used MIS for more than 1 year.

The effect of MIS on the response variables is estimated using a whole period mixed effects model. Though the significance probabilities for the *F*-tests (*p*-values) are reported, it should be kept in mind that

these only give some rough indication of significance; the data are non-experimental and consist of several simultaneous time series for which it is almost impossible to model joint stochastic behavior. A model for the whole period 1987–1996 was developed and analyzed using PROC MIXED of SAS (1996). A mixed model is one that contains both fixed and random effects. Factor effects are random if the levels of the factor that are used in the study represent only a random sample of a larger set of potential levels. The following regression model was used:

$$Y_{ij} = \alpha \text{YEAR}_{ij} + \beta_i \text{HERD}_{ij} + \chi \text{HF}_{ij}$$

$$+ \varepsilon \text{HERDSIZE}_{ij} + \phi \text{CORREC} + \varphi \text{MIS05}_{ij}$$

$$+ \gamma_{ij} (\text{MIS05} * \text{HERD})_{ij} + \eta_j (\text{YR}(\text{CORREC}))$$

$$+ \text{error}_{ij}$$

Although the NRS data set contained many variables to support management, the average annual amount of milk, fat and protein produced per cow were used as dependent variables (Y) to analyze the MIS effect. In addition, average annual calving interval (also dependent variable) was used as an indicator of the reproductive performance. This highly aggregated figure contains all the effects that MIS may have on the major reproduction performances.

The regression model estimates Y for herd i and year j with the following independent main variables: YEAR (year of particular observation), HERD (e.g. $HERD_{ij}=1$ if observation is of that particular herd and is a class variable (i.e. farm dummy); otherwise 0), HF (percentage of breed Holstein Friesian), FH (percentage of breed Friesian Holland), HERDSIZE (number of cows), CORREC (e.g. CORREC=0, if observation is of year<1992; otherwise CORREC=1), MIS05 (e.g. MIS05 $_{ij}$ =0 if herd i did not use MIS in year j) and an error term. CORREC was introduced because yearly production records in the NRS data base had been redefined in 1992. Production records before 1992 were on the basis of lactation production, from 1992 onwards records were based on 305 days in production (records with less than 305 days, but 200 or more days were incorporated unmodified). The term MIS05*HERD was added to account for differences in MIS05 effect among herds. Notice that YEAR and YR are a linear and class variable, respectively, both containing the year. Because the choice to adopt an

MIS appears to depend on previous or current herd conditions, we specified HERD as a fixed effect rather than as a random effect. Because the benefits of an MIS could vary from herd to herd, we superimposed a random interaction of MIS05 and HERD on a fixed MIS05 effect. Finally, because graphical examination of residual plots we introduced a random interaction of YR and CORREC. The default variance component estimation procedure of PROC MIXED was used, that is the restricted maximum likelihood procedure (REML).

On average, the MIS installation is in the middle of the investment year. So the MIS effect is introduced as a regression coefficient on a regression variable (MIS05) with values of 0 (for non-MIS herds and for MIS before the switch), 0.5 (MIS in year of switch) and 1 (MIS after switch).

Three 'secondary' analyses were performed. Firstly, the presented model was used to try and explain any changes in heat detection percentage, interval calving to first insemination and non-return percentage at 56 days after insemination due to adoption of MIS. These three reproduction variables determine ultimately calving interval. Management practices and information use are likely to differ by farm size (Lazarus et al., 1990). Secondly, in order to obtain results applicable to the different herd sizes, two subsets of the original data were analyzed with the model as described earlier. Herd sizes in the subsets in 1987 were <50 and ≥50 cows. Thirdly, MIS effects were tested for each year after adoption, clarifying whether the effects of MIS use occurs as an instant jump at the time of adoption or increases during the following years after adoption. In the adjusted statistical model, class 0 (non-adopters and herds before adoption) has been compared with three classes: 1 (year of adoption); 2&3 (second and third year after adoption) and >3 (more than 3 years after adoption).

3. Results

The cases and controls closely matched each other in 1987 with respect to the variables under research. Average milk production per cow and standard deviation for cases were 6581 and 698 kg and for controls 6572 and 680 kg, respectively. Herd size over years for herds enrolled in an MIS and herds not enrolled

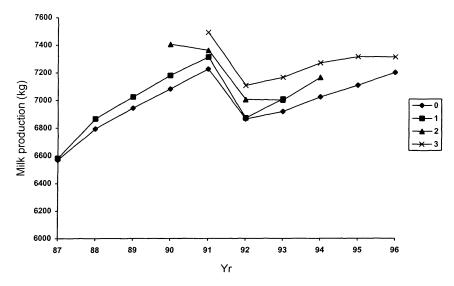


Fig. 1. Average for milk production according to categories of MIS use: 0: non-MIS adopters; 1: NO MIS use yet; 2: MIS enrolment in current year; 3: MIS use more than 1 year.

was similar. Herd size for these two categories in 1996 were 60 versus 59, indicating a randomness in MIS adoption with respect to the autonomous growth of the farms. Faster increasing herds were not more inclined to adopt an MIS than slower increasing (control) herds. The average herd size and milk production of the total NRS data base were lower than the herds before MIS adoption in 1987. The average NRS herd had 44 cows and had an average milk production of 6270 kg per cow. The MIS adoption group had 58 cows and 6581 kg, respectively, stressing the importance of inclusion of matching control groups.

The change in rolling herd average milk (Fig. 1) depicts that categories 2 and 3 are higher than 0 and 1, which indicates that MIS benefits increased over the years after adoption, rather than being an instant jump, since category 3 realizes a higher average production than category 2. The instant decrease in milk production in 1992 clearly shows the necessity to incorporate a correction factor into the regression model.

Table 1 shows the estimation results of PROC MIXED for milk production. The incorporated effects were significant and all fixed effects, except for the variable HERD, had a degree of freedom of 1. The significant estimate of milk production from the MIS is 62 kg (S.D.=25), while the estimate of protein production (Table 2) from the MIS is 2.36 kg (S.D.=0.90,

Table 1 PROC MIXED results of random and fixed effects for milk production

Covariance parameters		P> Z
Random effects		
YR (CORREC)		0.0675
MIS05 ^a *HERD		0.0001
Residual		0.0001
Source	NDF	P>F
Fixed effects		
HERD	713	0.0001
YEAR	1	0.0001
CORREC	1	0.0001
HF	1	0.0001
FH	1	0.0001
HERD _{SIZE}	1	0.0001
MIS05	1	0.0149
Parameter	Estimate	P> T
Estimate results		
MIS05	62	0.0149

^a MIS05=0 for herds that were not enrolled in an MIS and for herds that would be enrolled in an MIS in the future but had not adopted the system yet; MIS05=0.5 for herds that were enrolled in an MIS and had adopted the system in the current year and MIS05=1 for herds that were enrolled in an MIS and had completely adopted the system. Standard deviation of the estimated models was 329 kg.

both significant at p=0.05). In the second model the variable FH was not significant and excluding this variable from the regression model did not change the effect on MIS05. Estimated effect on fat production from the MIS was not significant. Calving interval shortened by 5 days (S.D.=0.75, Table 3) as a result of MIS use. The goodness of fit obtained from the PROC MIXED statistics of the models used, measured by the standard deviation of the estimates, was: milk=329 kg (Table 1); protein=12 kg (Table 2) and calving interval=15 days (Table 3), respectively.

The additional dependent variables heat detection percentage (1.22%), interval calving to first insemination (-3.20 days) and non-return percentage at 56 days after insemination (-1.67%) were all significantly affected by MIS use (Table 4).

Analysis of the two subsets in which herd size was in 1987 <50 and \ge 50 cows showed substantial differences (Table 5). Only the estimated effect on

Table 2
PROC MIXED results of random and fixed effects for protein production

Covariance parameters		P> Z
Random effects		
YR (CORREC)		0.0658
MIS05a*HERD		0.0001
Residual		0.0001
Source	NDF	<i>P>F</i>
Fixed effects		
HERD	713	0.0001
YEAR	1	0.0001
CORREC	1	0.0001
HF	1	0.0001
FH	1	0.8245
HERD _{SIZE}	1	0.0001
MIS05	1	0.0086
Parameter	Estimate	P> T
Estimate results		
MIS05	2.36	0.0086

^a MIS05=0 for herds that were not enrolled in an MIS and for herds that would be enrolled in an MIS in the future but had not adopted the system yet; MIS05=0.5 for herds that were enrolled in an MIS and had adopted the system in the current year and MIS05=1 for herds that were enrolled in an MIS and had completely adopted the system. Standard deviation of the estimated models was 12 kg.

Table 3
PROC MIXED results of random and fixed effects for calving interval

interval		
Covariance parameters		P> Z
Random effects		
MIS05 ^a *HERD		0.0001
Residual		0.0001
Source	NDF	P>F
Fixed effects		
HERD	713	0.0001
YEAR	1	0.0001
HF	1	0.0001
FH	1	0.0001
HERD _{SIZE}	1	0.0001
MIS05	1	0.0001
Parameter	Estimate	P> T
Estimate results		
MIS05	-5.28	0.0001

^a MIS05=0 for herds that were not enrolled in an MIS and for herds that would be enrolled in an MIS in the future but had not adopted the system yet; MIS05=0.5 for herds that were enrolled in an MIS and had adopted the system in the current year and MIS05=1 for herds that were enrolled in an MIS and had completely adopted the system. Standard deviation of the estimated models was 15 days.

calving interval was significantly affected for the relatively bigger farms in 1987, while milk, protein and calving interval were significantly effected for the relative smaller farms. The relatively bigger farms were characterized in 1996 according to a higher milk production (7458 and 7145 kg), protein production (260 and 250 kg) and calving interval (397 and 392 days). In this subset average herd size decreased from 74 in 1987 to 71 cows in 1996. In contrast, herd size increased on relatively smaller farms from 37 in 1987

Table 4
Estimated effects of an MIS on reproduction variables in order to explain shortened calving interval

	Average 1996	Estimate	P> T
Heat detection (%)	54	1.22	0.0001
Interval calving — first insemination (days)	81	-3.20	0.0001
Non-return at 56 days (%)	63	-1.67	0.0008

Table 5 Estimated effects and *t*-values of an MIS for two subsets in which herd size in 1987 was <50 and \ge 50 cows

	Estimate	P> T
Milk production (kg)		
<50 cows	80	0.0413
≥50 cows	18	0.5814
Protein (kg)		
<50 cows	3.10	0.0265
≥50 cows	0.48	0.6756
Calving interval (days)	
<50 cows	-6.61	0.0001
≥50 cows	-5.04	0.0001

to 44 cows in 1996. Possible explaining variables for the estimated differences, such as management practices and information use, were not available. One of the many possible explanations can be the fact that initial larger farms had to have a higher level of management and information use in order to run their larger business. A more formal information use (MIS) would then result in a smaller potential improvement.

In Table 6 the results are shown in which MIS05 is a class variable as opposed to continuous variable described in the previous sections. Pair wise comparisons of the least squares means between 0 and 1, 0 and 2&3 and 0 and >3 years after MIS adoption have been tested for statistical significance. Estimates of MIS use

Table 6
Estimated effects of years after adoption vs. non-adoption and p-values of an MIS^a

	Estimate	P> T
Milk production (kg)		
None vs. first year	37	0.1546
None vs. second and third year	47	0.0701
None vs. >3 years	69	0.0039
Protein (kg)		
None vs. first year	1.54	0.0942
None vs. second and third year	1.93	0.0382
None vs. >3 years	2.58	0.0022
Calving interval (days)		
None vs. first year	-2.41	0.0147
None vs. second and third year	-3.94	0.0001
None vs. >3 years	-6.12	0.0001

^a Technology effects are incorporated into the regression model as class variables.

showed significant effects on milk (47 kg), protein production (1.93 kg) and calving interval (-3.94 days) in case of non-adopters versus second and third year after adoption. In general, first year performances were lagging behind performances of the following years. Changes in milk, protein and calving interval increased in the following years. So, these effects acted like a trend over several years, rather than an instant jump at the time of adoption.

4. Conclusion

Farms without MIS adoption, with similar performance records in the base year 1987 in comparison with farms with MIS adoption, were incorporated into the models in order to improve estimations and were constructed in such a way that MIS herds were compared with non-MIS herds with initially similar production and herd size. MIS adoption and use improved annual milk (carrier) production by 62 kg, protein production by 2.36 kg per cow and reduced calving interval by 5 days.

The effect of an increased milk production per cow (with the same milk content) on net farm income under Dutch milk quota conditions is approximately Dfl. 0.30 kg⁻¹, assuming a good alternative use for production factors (labor, capital and buildings) and savings on variable costs (feeding costs for maintenance and AI costs) that come available when the same amount of milk (quota) can be produced with fewer cows (Jalvingh and Dijkhuizen, 1997). The additional protein increase corrected for improved carrier production was approximately 0.19 kg ($2.36-62/100\times3.5$) with a value of Dfl. $13.23 \,\mathrm{kg}^{-1}$ of protein increment. Calving interval was shortened by 5 days, which is estimated to increase net return to labor and management by Dfl. 2.16 per day per cow per year (Jalvingh and Dijkhuizen, 1997). So, net return to labour and management increased by approximately Dfl. 30 per cow per year as a result of MIS adoption and use. For a typical Dutch farm in the sample of 60 cows analyzed, increase in income equals Dfl. 1800 per year. Investment in an MIS included Dfl. 2000 for a PC, Dfl. 500 for a printer, Dfl. 2000 for MIS software and Dfl. 1000 per year after the first year for service and updates. The pay-back period was approximately 5 years of the system (including the hardware), and therefore, MIS

appears to be economically profitable. This analysis does not take into account the cost of any additional time and management requirements from the operator in adopting and using MIS.

The panel data analysis has proven to be fruitful to evaluate the benefits of MIS. Therefore, additional information technology adoptions could (and should) be evaluated in a similar empirical manner to clarify whether these technologies increase dairy profitability. For example, automated concentrate feeders, on-line milk production measurement and activity measurement on milk production and reproduction.

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