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The epidemiology of culling and mortality of New Zealand dairy cows

A thesis presented in partial fulfilment of the requirements for the degree of

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in

Veterinary Epidemiology

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#### Abstract

Culling of dairy cattle for non-production causes and on-farm mortality have adverse consequences for farm profitability and animal welfare. Farmers face increasing pressures to improve farm profit and to answer concerns from the public and consumers about the welfare of their animals and ethics of their management systems. Farmers in New Zealand need new information to both develop control programs to reduce losses that arise from non-production culling and mortality, and to promote and defend their farming system. Our main aims were to define the current and past trends in the incidence of culling and mortality in New Zealand dairy cows, and investigate their associated risk factors. Our secondary aims were to review the incidence of culling and mortality in dairy cattle in other modern dairy industries against which the findings from New Zealand studies could be compared, to evaluate any limitations for analysis of electronic database records of culling and mortality of New Zealand cows, and, to estimate the financial consequences for herd owners of reduced incidence of non-production culling and mortality. We found no trend over the last two decades in the incidence of culling of dairy cows, either internationally or nationally, whereas, over the same period, the incidence of mortality in cows has increased internationally, but not in New Zealand. Additionally, we identified several disorders especially common in the period immediately following calving associated with increased rates of culling and mortality; that electronic database records of cows that had been culled or died were suitable for analysis when they came from a large population, but could be biased from individual herds; and that farm profits were increased when the incidence of culling and mortality was reduced. These findings provide new information to support New Zealand dairy farmers to develop their own performance targets and control programs to reduce the incidence of mortality and non-production culling of cows.

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### Preface and Acknowledgements

The background to this Thesis is a research partnership project between the New Zealand dairy industry, represented by DairyNZ, and the Ministry of Business, Innovation and Employment, named "Pillars of a Competitive and Responsible Dairy System: Improved Longevity and Reproductive Performance" [Anonymous, 2017a,b]. One aim of this project is to investigate "The prevalence of, and reasons for, premature mortality and health-related productivity losses in NZ dairy systems and how these are affected by farm management and nutrition, thereby improving the life of farmed animals and both the efficiency and sustainability of the industry." This partnership has two major components or 'pillars', namely cow fertility, and cow lifetime productivity, and it is the second of these that the work described in this Thesis contributes to. The PhD which this Thesis represents has been funded by this partnership, and is one of more than 10 programs to train emerging scientists and post-graduate students.

This Thesis is based on publications. The structure of the Thesis is centered around six chapters which describe separate studies, and these are surrounded by two chapters that firstly introduce, and then finally discuss the gathered findings. Each of these six study chapters were written originally in the style and format of a manuscript required for submission for publication in a peer-reviewed journal. An abstract and section for acknowledgements are included in each chapter as they would be submitted in a manuscript. The differences between a submitted manuscript and the format of each study chapter in this Thesis are that the tables and figures are placed within the body of the text rather than at the end, an interpretive summary has not be included as required by some publishers, a single bibliography is placed at the end of the Thesis rather than accompanying each chapter, and the spelling has been maintained as US English.

My first and deepest thanks go to my wife and greatest supporter, Jane. Jane has encouraged me daily, chided me when I have become distracted, and reminded me of why we set out on this path together. I have taken much time and energy out of our marriage and applied it to my PhD, and now look forward to redirecting that back to ourselves. I also thank my family and my friends who have shown interest in my work, and provided balance and welcome alternative activities. If you have caught some of my passion for lifelong-learning, and I know some have, then I am also encouraged.

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