



The Welfare of Beef Cattle in the Scientific Literature From 1990 to 2019: A Text Mining Approach

Elena Nalon¹, Barbara Contiero², Flaviana Gottardo^{2*} and Giulio Cozzi²

¹ Eurogroup for Animals, Brussels, Belgium, ² Department of Animal Medicine, Production and Health (MAPS), University of Padua, Padua, Italy

Beef cattle are the third most numerous terrestrial farmed animals worldwide. Factors such as geographical region, animal category, breed, and rearing system pose specific animal welfare challenges that can have an impact on animal and public health. This article uses text mining (TM) and topic analysis (TA) to explore the scientific literature on beef cattle welfare published in English from 1990 to 2019. Our aim was to reveal the main research topics and their evolution over time. Our analysis showed that the three most relevant themes in research since 1990 have to do with calf behaviour and management, efficiency, and environmental sustainability, and the effects of transport and slaughter on meat quality. Topics showing the most marked increase in the number of papers published deal with stakeholders' perceptions and market opportunities for added-value beef products and risk factors for morbidity and mortality, especially in relation to calf health, antimicrobial use, and antimicrobial resistance. The results indicate a particular focus on the welfare of calves, especially in the veal industry. Pain relief during the castration of calves and bulls also featured prominently. Research is also increasingly assessing aspects of beef cattle welfare that are interlinked to meat quality, the social and environmental sustainability of the sector in relation to market opportunities, and public health. The identified topics represent a basic source of information that can be used for further and more detailed analyses (e.g., systematic reviews) focussed on specific research themes or geographical areas.

Keywords: beef cattle, animal welfare, text mining, topic analysis, research

INTRODUCTION

Beef cattle (including buffaloes) are the third most numerous farmed animals worldwide (after poultry and pigs), with 71.61 million tonnes produced globally in 2018. In the same year, the EU produced 10.64 million tonnes of beef meat (1). Globally, cattle meat production has more than doubled since 1961, increasing from 28 million tonnes per year to 68 million tonnes in 2014 (1). In numerical terms, between 2000 and 2050 the global cattle population might grow from 1.5 billion in 2000 to 2.6 billion (2). Beef cattle farming practices differ substantially across the world, ranging from extensive to intensive and using different breeds (3). Each rearing system presents specific challenges for animal welfare (4–6) and, while guidance on best practice is available for some of the identified problems, knowledge gaps persist, for instance in the areas of disease prevention and monitoring, optimisation of live transport, use of environmental features, and enrichments (4).

OPEN ACCESS

Edited by:

Catherine Mary Dwyer,
Scotland's Rural College,
United Kingdom

Reviewed by:

Todd Duffield,
University of Guelph, Canada
Christoph Winckler,
University of Natural Resources and
Life Sciences Vienna, Austria

*Correspondence:

Flaviana Gottardo
flaviana.gottardo@unipd.it

Specialty section:

This article was submitted to
Animal Behavior and Welfare,
a section of the journal
Frontiers in Veterinary Science

Received: 03 August 2020

Accepted: 07 December 2020

Published: 11 January 2021

Citation:

Nalon E, Contiero B, Gottardo F and
Cozzi G (2021) The Welfare of Beef
Cattle in the Scientific Literature From
1990 to 2019: A Text Mining
Approach. *Front. Vet. Sci.* 7:588749.
doi: 10.3389/fvets.2020.588749

Specific issues are associated to the management, transport and rearing of male calves coming from the dairy industry, which are of limited commercial value (7).

The science of animal welfare has considerably evolved from the 1990s to the present day, and with it the recognition that animals are sentient beings, deserving of “a good life,” which includes opportunities to experience positive affective states (8). It is therefore of interest to investigate if and under what respects the sustained global increase in cattle production has propelled an interest in researching beef cattle welfare. This paper uses text mining (TM) and topic analysis (TA) to analyse the scientific literature on beef cattle welfare published in English from 1990 until 2019 to better understand the most important topics discussed in academic publications and their evolution over time. TM is defined as “The knowledge discovery process which looks for identifying and analysing useful information on data which is interesting to users from big amounts of textual data” and as such it is unique in its ability to analyse concept relationships “in order to find new structures, patterns or associations” and to “discover new facts and trends about the world itself” (9). More in detail, TM can be used to summarise or cluster information into charts or maps; identify hidden structures (and associations) between concepts or groups or concepts; extract hidden associations between textual elements; provide an overview of the contents of a large collection of documents; categorise texts by discovering relevant groupings (9). In other words, TM and TA represent tools that can produce a preliminary thematic screening of large numbers of documents to reveal a structured “map” of textual knowledge (10, 11) by uncovering recurrent topics and latent themes when the set of documents to analyse is large. For these reasons, TM is increasingly being used in the scientific literature as a tool to identify themes and future research avenues across a broad range of topics, including animal welfare studies (12, 13).

MATERIALS AND METHODS

Data Set

A literature search protocol was set up to identify peer-reviewed papers with at least an English abstract that covered the topic of beef cattle welfare using Scopus[®], the abstracts and citation database of Elsevier[®]. The keywords used were “bovine meat welfare,” “meat cattle welfare,” “veal welfare,” “beef welfare,” “beef cattle welfare,” and “heifer welfare.” The search was performed in January 2020. The initial timespan considered was between 1960 and 2019. As less than one relevant paper per year was published in the period 1960–1989, only papers published from 1990 onwards were retained for the full statistical analysis. An electronic Excel workbook was used to collect the data extracted from the identified papers. The spreadsheet was built in a 2-way table format considering every paper (record) as a row and its descriptive information in columns. A list of the descriptors used and additional information on data format are provided as **Supplementary Materials**. All datasets were merged and overlapping records were erased. Reasons for automatic exclusion were: no author available, no source available, document type erratum, no document type available. Additionally, two reviewers (EN and BC) independently screened

the titles and abstracts for relevance to the research topic (i.e., papers dealing with one or more aspects of beef cattle welfare). The criteria for manual exclusion of the papers were (1) wrong topic or focus (for instance, social and economic welfare) or (2) wrong species or sector (e.g., welfare of dairy cattle). Citations were excluded from the database if one or both criteria for exclusion were chosen by both reviewers for the same paper. Disagreements were resolved by consensus with the mediation of FG. The geographical localisation of each record was derived based on the affiliation of the corresponding author/first author. Some descriptive statistics of the selected records were prepared to profile the scientific corpus based on information recorded from the Scopus database. A regression analysis of the number of published papers on years was performed to calculate the trend by year of the scientific interest for this topic.

Text Mining

A TM analysis was performed on the abstracts of the selected papers to find important patterns in text data as described by Wang et al. (10) and Contiero et al. (12). This technique converts text into numeric information and highlights the word frequency distributions. The text pre-processing consisted in three steps: tokenisation, filtering and stemming (14). Tokenisation is the process of finding words, separating them and reducing them to lowercase. Filtering is also called stop-word removal (exclusion of characters such as punctuation and blanks, exclusion of stop words such as articles, prepositions, and conjunctions, etc.). Stemming reduces word variants to their root form and we used Porter stemming algorithm to perform this feature (15). In addition, keywords used in the bibliographic search were removed to avoid poor discriminative information due to their presence in almost all abstracts retrieved (10). The words were organised into a matrix that contains the documents along the rows and the terms along the columns (so-called document-term matrix). A term frequency-inverse document frequency technique (TFIDF) was used to attribute a relative weight to words (16). This represents the frequency of a term adjusted for how widely it is used, thus reflecting how important a word is in the whole collection of documents. The words with the greatest relevance ($TFIDF \geq 8$) were represented as histogram. A cloud of the most relevant words ($TFIDF \geq 5$) was also created (<https://www.wordclouds.com/>) in which a bigger character size indicates a higher TF-IDF value. The statistical analysis was conducted with R package (2017) using the libraries tm, stringr, and SnowballC.

Topic Modelling

Topic modelling is a tool to uncover the structure of meaningful themes among collections of documents as well as to discover hidden textual patterns [something similar to a principal component analysis of a given dataset of words; (17)]. Latent Dirichlet allocation (LDA), one of the most popular approaches to perform topic modelling analysis, was applied for the text mining of our abstract corpus (10). A single topic can be described as a multinomial distribution of words, and a single document can be described as a multinomial distribution of latent topics. This model provides both a topic representation of

all the documents and the word distributions of all the topics, in an iterative process implemented using a Gibbs sampling. At the end of the iterative process, a posterior distribution was calculated to estimate the topic mixture of each document (by counting the proportion of words assigned to each topic within that document) and the words associated to each topic (by counting the proportion of words assigned to each topic overall). We used LDA function with Gibbs sampling option of the *topicmodels* package in R (18). The individual topics were presented as an unstructured set of words using the bar histogram representation, where every bar relative to every word is proportional to the probability of the word within a topic (beta value). The cumulative probability of the 10 most probable words for different numbers of topics was calculated.

The number of topics needs to be fixed a-priori. As the “ideal” number is in general not known, several models with different number of topics were fitted and measures of evaluation were calculated. In a first approach, the perplexity of holdout and training datasets was calculated. Perplexity measures how well a probability model predicts a sample. A lower perplexity score indicates better generalization performance (19). The document-term matrix was split in two parts: the first one, which included 80% of the documents, was used as training dataset and the last one as test dataset (hold-out set). For different numbers of topics (from 2 to 20) LDA models were fitted on the training dataset. Using the results obtained in the training dataset, the perplexity index was calculated both for the training and the holdout datasets. This machine learning approach permits to test the adequacy of a model developed in a training dataset measuring its performance on an hold-out dataset. A second approach to fix the number of topics is based on the harmonic mean of the likelihood of a set of samples generated by the Gibbs sampler (20). In this case a higher value of the harmonic mean is better. A hierarchical cluster analysis approach was adopted for the topics analyses with different number of topics. The topic-word matrix (first 100 most probable words) was transformed to binary data with a 1/0 to indicate presence of a word in a given topic. Finally, a trend analysis of the proportion of each topic by year was performed to test the dynamics of all topics over time.

To explore the relationship between topics, we performed hierarchical clustering analysis. The results are presented as **Supplementary Materials**.

RESULTS

Descriptive Statistics

The distribution of the results of the initial bibliographic search by string on titles, abstracts, and keywords is shown in **Table 1**. The most numerous articles concerned the string “beef welfare” (81%), followed by “beef cattle welfare” (60%), “meat cattle welfare” (41%), “heifer welfare” (30%), “bovine meat welfare” (15%) and, lastly, “veal welfare” (11%). After removal of overlapping records and manual removal of irrelevant ones, 983 records were retained for further analysis.

Looking at the trend for the number of papers per publication year, from 1990 to 1996 fewer than 10 papers on beef cattle welfare were published annually, whereas from 1996 to 2019

TABLE 1 | Bibliographic search strings for the text mining analysis on the welfare of beef cattle carried out on titles, abstracts and keywords of peer-reviewed literature in English published between 1990 and 2019.

Search string	Original n. of records
Beef welfare	794
Beef cattle welfare	594
Meat cattle welfare	412
Heifer welfare	295
Bovine meat welfare	147
Veal welfare	110

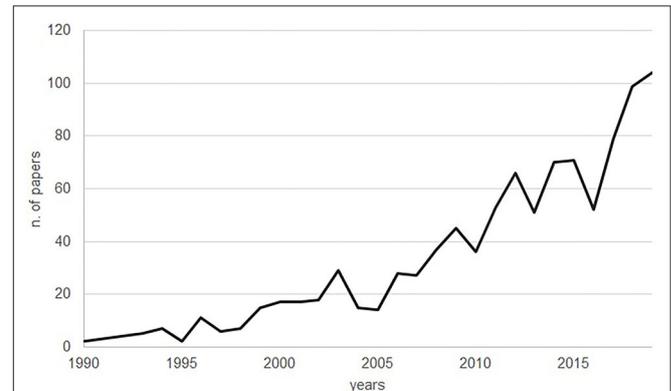


FIGURE 1 | Peer-reviewed articles on the welfare of beef cattle published within the period 1990–2019. From 1996 onwards there was a significant increase in the number of papers published annually (by interpolation: 3/year).

there was a significant increase of 3 papers per year (interpolation of data using a regression analysis from 1990 to 2019: $y = 3.28x - 6529$ $R^2 = 0.85$; **Figure 1**).

Nearly half of the identified papers had first or corresponding authors based in Europe (members of the European Economic Area and Switzerland; 46%). The second most important area of provenance of authors was North America (25%), followed by South America (11%), Oceania (9%), Asia (6%) and, lastly, Africa (3%).

A breakdown of articles per country of the European block is shown in **Figure 2**.

The distribution of published papers by journal title (with at least 10 papers published on the topic in the period considered) is shown in **Figure 3**. The most frequent publishing sources of the retained papers were scientific journals dealing with animal (production) science, animal welfare and behaviour, and meat quality, whereas the journals focused on veterinary science were a less important publishing channel (15%).

Research articles represented the most common type of retained paper (76%) followed by reviews (13%), conference papers (6%), and others (5%). The papers were published in 310 scientific journals. As a whole, the 983 articles had collected—as of January 2020—a total of 15,208 citations. The most cited article was published in 2004, collecting 392 citations, followed by an article published in 2010 that collected 235 citations.

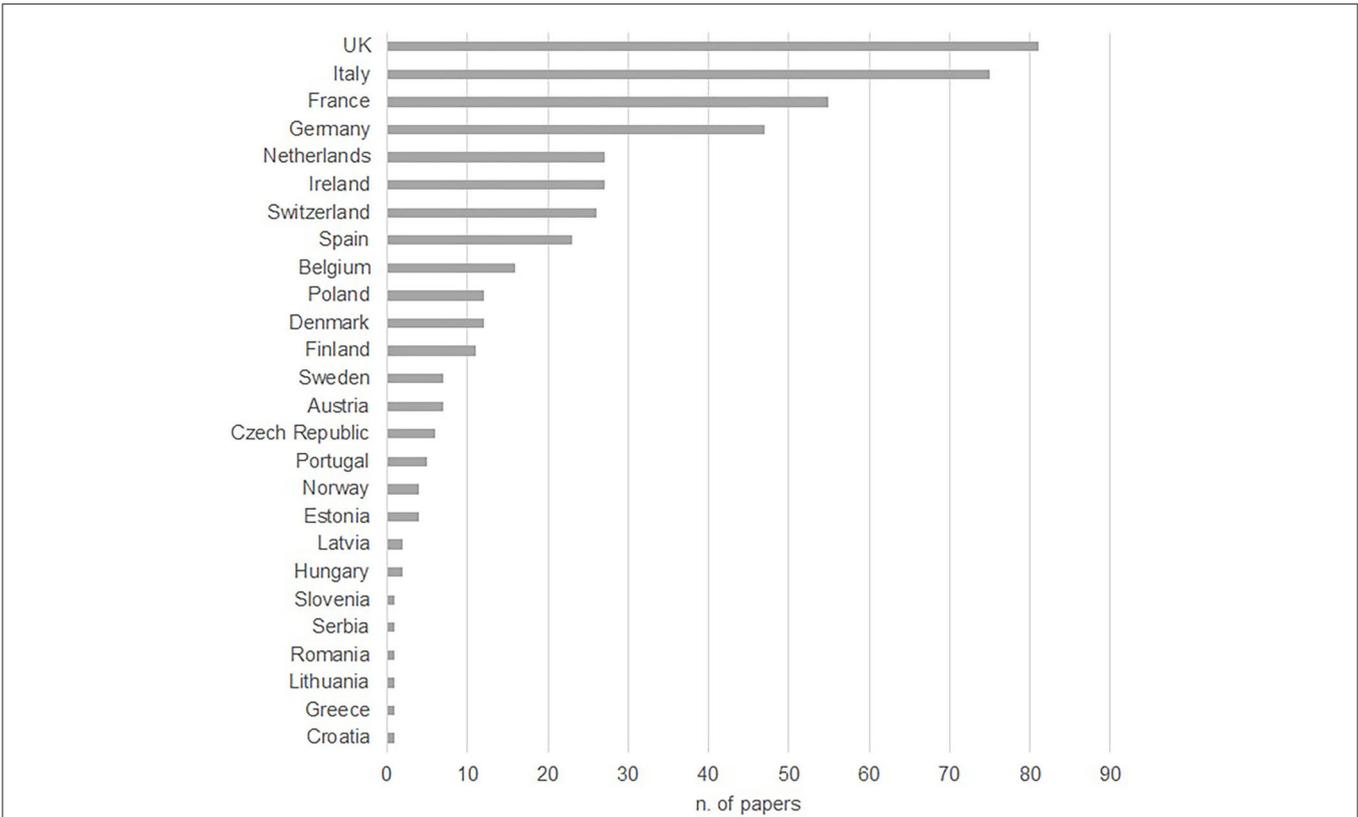


FIGURE 2 | Distribution by European country of peer-reviewed papers on the welfare of beef cattle based on the nationality of the first/corresponding authors and published between 1990 and 2019.

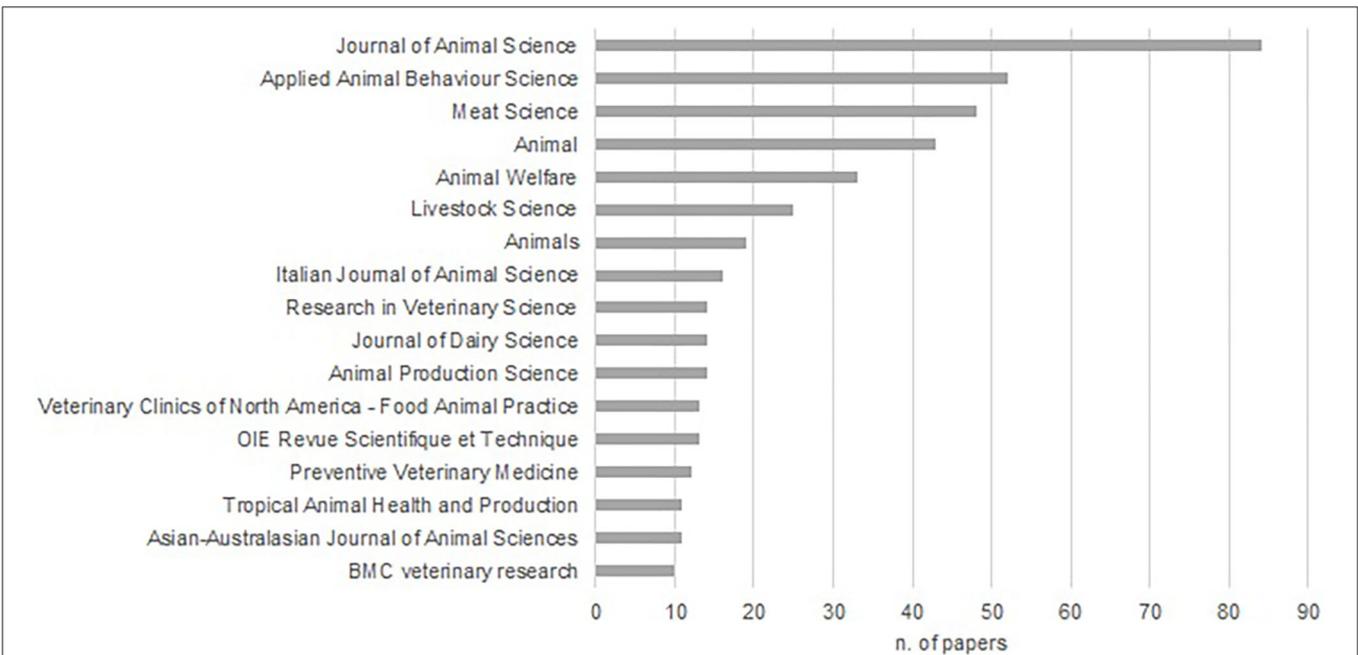
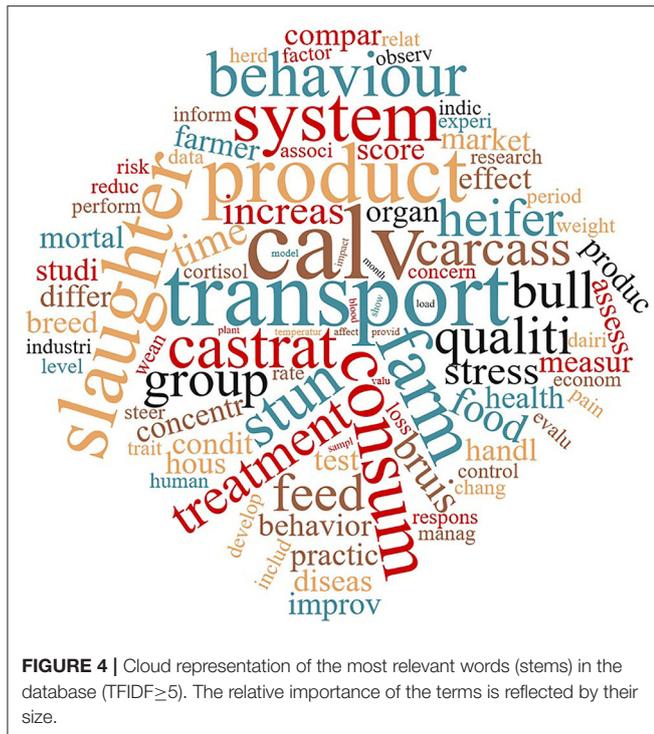


FIGURE 3 | Distribution of published papers by journal title (with at least 10 papers published on the topic in the period considered). The most frequent publishing sources of the retained papers were scientific journals dealing with animal (production) science, animal welfare and behaviour, and meat quality, whereas the journals focused on veterinary science were a less important publishing channel (15%).



Text Mining Results

Text mining analysis was performed to identify the most important words of the data corpus. The pre-processing of the data produced 106,108 words and after reduction of sparseness (exclusion of the “rare words”) 1,490 terms were retained from the selected 983 documents. The most relevant words according to the TFIDF ponderation system (TFIDF \geq 5) are represented in **Figure 4** as a cloud in which the size of the font is proportional to the TFIDF of every word. Looking at the first 10 word stems, the most important was calv- (TFIDF=18.4), followed by transport (TFIDF=13.8), product (TFIDF=12.3), slaughter (TFIDF=11.6), system and farm (TFIDF=10.7), consum- (TFIDF=10.5), stun- (TFIDF=10.1), castrat- (9.9), and behaviour (9.6).

Topic Visualisation

We created a visualisation (histograms) of the ten most probable words of the topics in LDA taking into account five, ten, 15 and 20 topics, respectively. The cumulative probability of the ten most frequent words for LDA with five topics was smaller than that for LDA with ten, 15 and 20 topics. The average cumulative probability of the ten most frequent words was 0.19, 0.26, 0.31, and 0.35 for 5, 10, 15, and 20 topics, respectively. This is because if a small number of topics is assumed, a few words may not convey a topic meaning sufficiently and different issues will be lumped together (10). By expanding the number of topics assumed it is possible to discover additional themes. We tried several approaches to select an optimal number of topics. The first was based on the calculation of the perplexity index for a training and a test dataset, respectively (19). A second approach

was based on the harmonic means of the likelihood of different models obtained with different number of topics (20). The results of these two approaches are shown in **Figure 5**.

As expected (**Figure 5A**), the perplexity of the training dataset was lower than the one calculated for the test set. Both curves decreased as the number of topics increased. In **Figure 5B** the harmonic means was instead increasing. No local minimum or maximum were found for perplexity or harmonic means. The two functions were monotonically decreasing or increasing, respectively, according to the increasing number of topics. Therefore, no clear suggestion on the ideal number of topics could be derived from these analyses.

Lastly, we considered the hierarchical clustering of the topics obtained with five, ten, 15 and 20 topics. The within-class variance component accounted for 89, 96, 96, and 97% of variance, respectively. The maximum increment was accomplished between five and ten topics; a plateau was reached with higher values. This means, in practice, that beyond ten topics there was no improvement in the capability of the model.

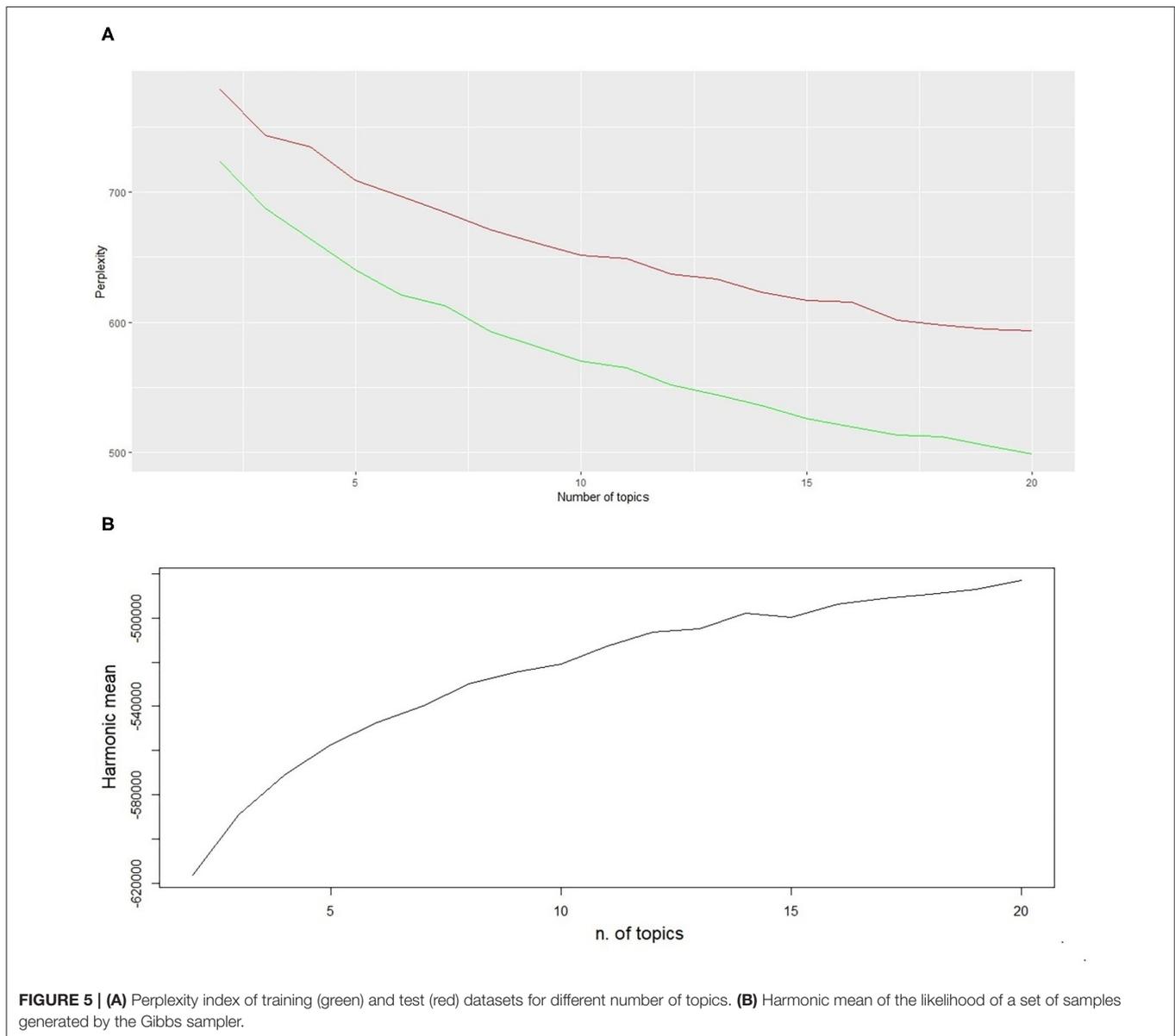
Taking into account the outcomes of these three analyses, we selected the LDA with 15 topics. The ten most probable words in the 15 topics are reported in **Figure 6**.

Based on the most relevant words and the papers belonging to each topic, we tentatively attributed a theme to each topic (**Table 2**). The first three topics per number of papers published under each topic were topic 12 (effects of transport and slaughter on carcass quality), topic 2 (stakeholders’ perceptions), and topic 8 (efficiency and environmental sustainability). Topic 4 (food safety and public health) closely followed topic 8. The cumulative probabilities (cp) calculated for the ten most relevant words in the topics showed that topics 5 (calf behaviour and management), 8 (efficiency and environmental sustainability) and 12 (effects of transport and slaughter on carcass quality) were the most important statistically (cp = 0.50, 0.41 and 0.38, respectively).

Table 3 shows the results of the trend analysis for the period 1990 to 2019. For each topic, the percentage of papers published in the considered time interval was analysed as a function of the year. The estimated regression coefficient represents the variation (increase/decrease depending on the sign of the coefficient) in the percentage of published papers for each incremental unit of the time. There was a significant increase in the number of papers dealing with topics 2 (stakeholders’ perceptions), 7 (risk factors for health and mortality), 9 (health and welfare of heifers) and 14 (prevention and treatment of common bovine diseases), whereas the numbers of papers published on topic 15 (new economic models) decreased in the considered time frame. Topic 12 (effects of transport and slaughter on carcass quality), although the first for number of papers published over time, had a stable trend, whereas topic 2 (stakeholders’ perceptions) was the one showing the most pronounced trend toward increase.

DISCUSSION

LDA applied to academic papers on beef cattle welfare captured several fields of investigation that are of known relevance, for instance pain relief during invasive procedures, the effects



of transport and slaughter, the management of heifers and calves, and the treatment and prevention of disease. This characteristic—being able to identify known facts—has been proposed as evidence of the trustworthiness of the text mining algorithms (10). Additionally, the terms “heifer” and “calf” were included in the search keywords, and the topic analysis recaptured them, which is an indicator of the soundness of the methodology used. LDA modelling also revealed other topics that are of increasing societal interest, such as the link between animal welfare, sustainability and wider market issues, and the attitudes and perceptions of stakeholders such as consumers and farmers.

The geographical distribution of the first authors shows that half of the papers had first authors in Europe, followed by the United States. Besides having a strong focus on scholarly publishing in English, these two geographical areas have similar

beef production data [10.64 million tonnes for the EU vs. 12.22 million tonnes for the United States; (2)]. Within the EU, the UK had the highest proportion of first authors, which does not surprise, as the UK is the cradle of the farmed animal welfare movement in Europe (21, 22) as well as being an important beef producing country. The first ten countries with high proportions of first authors are also among the main beef producing countries in Europe, with the exception of Switzerland, which however, just like the UK, has a long-standing tradition of protecting animal welfare [since 1992, Switzerland has recognised in its constitution the concept of animal dignity as well as animal well-being; (23)]. Compared to other fields of research, in which Asia (China in particular), South America and Oceania are very well-represented in terms of scientific publications, beef cattle welfare literature in English was less popular.

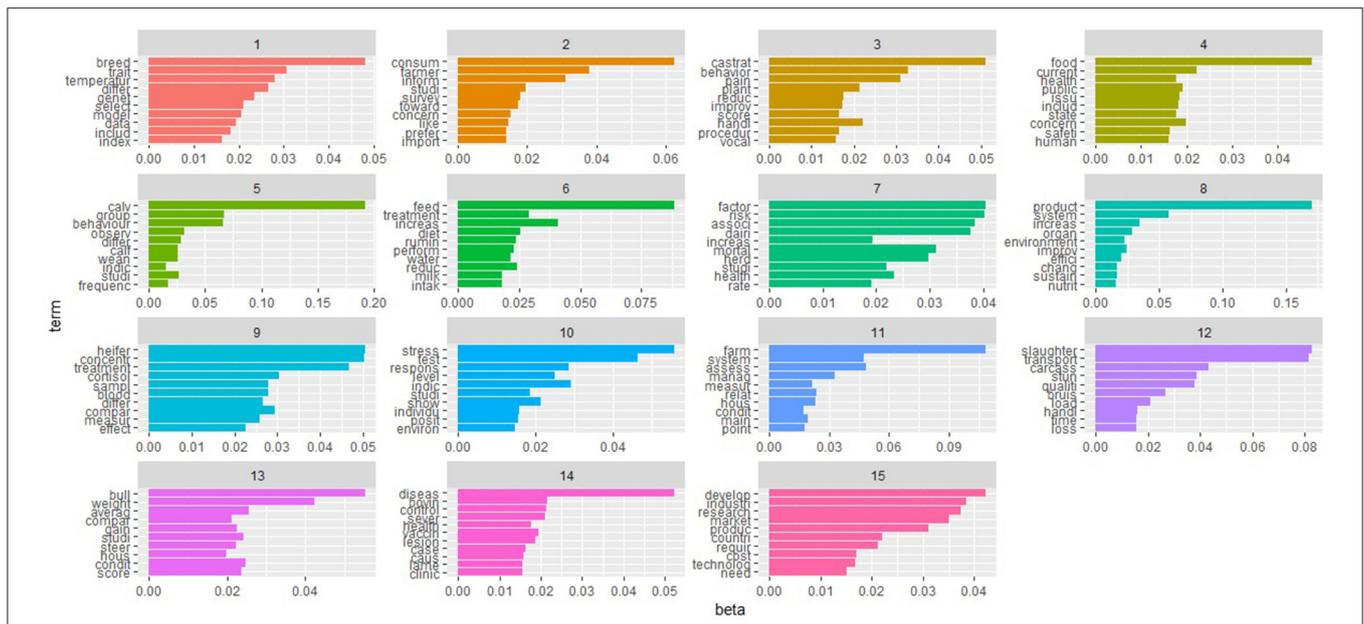


FIGURE 6 | Histograms representing the most relevant words per topic in the LDA with 15 topics (beta=probability that a word belongs to a given topic).

TABLE 2 | Topics that emerge from the LDA analysis.

Topic	Theme	Papers (n)
1	Genetic selection and breeding	54
2	Stakeholders' perceptions	100
3	Pain management	68
4	Topics in food safety and public health	80
5	Calf behaviour and management	46
6	Feeding strategies and performance	47
7	Risk factors for morbidity and mortality	44
8	Efficiency and environmental sustainability	81
9	Health and welfare of heifers	64
10	Stress responses and indicators	48
11	Housing and management	36
12	Transport, slaughter and carcass quality	116
13	Housing conditions and weight gain in steers and bulls	61
14	Prevention and treatment of disease	66
15	New economic models	72

We attributed a description to each topic by considering the 10 most probable words per topic in the LDA with 15 topics. The number of papers dealing with each topic is also shown.

TABLE 3 | Trend analysis of the 15 LDA topics by year (1990–2019).

Topic	Year of appearance of first publication	Regression co-efficient	P	R ²
1	1996	0.001	0.333	0.04
2	1997	0.004	0.001	0.34
3	1994	-0.002	0.426	0.02
4	1994	<-0.001	0.980	<0.01
5	1994	<-0.001	0.761	<0.01
6	1998	<-0.001	0.987	<0.01
7	2002	0.003	0.003	0.30
8	1993	<0.001	0.681	<0.01
9	1998	0.002	0.014	0.21
10	1995	-0.001	0.425	0.02
11	1993	<-0.001	0.958	<0.01
12	1990	<-0.001	0.803	<0.01
13	1993	-0.003	0.120	0.09
14	1997	0.003	0.017	0.20
15	1990	-0.006	0.020	0.20

The regression coefficient, estimated parameter of the regression analysis, represents the incremental variation (increase/decrease) of the percentage of published scientific papers for each year. P is the significance and R² is the coefficient of determination of the model.

From 1960 to 1989, our search criteria identified on average less than one relevant paper per year published in English on beef cattle welfare. This is not surprising if we consider the history of animal welfare science. As highlighted by Broom (24), in the 1970s and early 1980s the term animal welfare was used but still not defined, and many considered it to be unscientific. Only in the early 1990s did scientists agree that animal welfare is measurable, and hence that it is a scientific concept (24). Our results show a steady increase in the number of papers

on beef cattle welfare published yearly in English starting from 1996. Considering that cattle numbers worldwide increased in a gradual and consistent manner from the 1960s onwards (1), the number of published research papers on beef cattle welfare appears to have been markedly influenced by the evolution of animal welfare science.

The main word stems that emerged from the TDIF analysis were, in descending order of importance, “calv-,” “transport-,”

“product-,” “slaughter,” “system-,” “farm-,” “consum-,” “stun-,” “castrat-,” and “behaviour.” Most of these terms are also included in the first three topics identified after LDA analysis, and therefore they will be discussed below.

The identified topics are comprehensive as, besides animal welfare, they include animal health and behaviour, meat quality, sustainability, and the social dimension. The analysis of cumulative probability identified the three most important topics statistically. The most significant was “calf behaviour and management” (topic 5). The tokenised words belonging to this topic were “calv-, group-, behaviour-, observ-, differ-, calf-, wean-, indic-, studi-, frequenc-.” The articles retained in the database reveal a scientific focus on aspects of animal welfare at calving and the optimisation of calf welfare (based on behavioural and physiological indicators) to reduce stress and improve growth. Some aspects were common to the literature on beef and dairy cattle, whereas others were specific to each sector. A common aspect is the correct management of difficult calving (dystocia) from the perspective of the health and welfare of both the cow and calf (25, 26). Several studies also assessed weaning stress. The weaning process includes handling, a more or less abrupt cow-calf separation and, sometimes simultaneously, transportation, sudden changes in the diet, and social reorganisation due to regrouping. All of the events taking place around this phase are sources of stress and potential health problems for both beef and dairy calves (27, 28). Cows also experience stress due to separation from their calves at weaning (28–30). Studies assessing methods to reduce stress around weaning typically rely on a mixture of behavioural and physiological indicators to compare the relative benefits of different separation strategies (e.g., two-step weaning; (27, 31, 32). Handling and transport also have an effect on stress indicators and growth in beef calves (33). The veal sector presents specific challenges: male dairy calves are typically separated from the cows immediately or 24–48 h after birth. They are normally housed individually for the first weeks of life and weaning—the gradual change in diet from milk or milk replacers to solid feed—can occur as early as 6 weeks of age. This is in itself a very stressful event with potentially long-lasting consequences (34). Research has shown that male dairy calves are given less care and attention than heifer calves due to their lower commercial value (7). One conclusion is that farmers need better information on colostrum feeding regime and pain management for these animals. Studies in the database also dealt with the management of calves kept in group housing to improve animal welfare and maximise growth (35–37).

The second most important topic identified by the statistical analysis was “efficiency and environmental sustainability” (topic 8). The word stems making up this theme are “product-, system-, increase-, organ-, environment-, improv-, effici-, chang-, sustain-, nutrit-.” The recurring theme in this group of papers is a recognition that the beef industry is under public scrutiny for several respects (e.g., food safety, environmental footprint, animal welfare) and that several adaptations will be necessary to address all of these concerns (38, 39). According to the selected literature, such adaptations can be possibly achieved by improving production efficiency and meat quality, addressing

animal welfare issues, and diversifying rearing systems wherever possible, for instance by adopting organic or agro-ecological farming techniques (40, 41). Achieving and expanding the profitability of “alternative” beef rearing systems depends on a complex interplay of factors. These include market readiness and resource availability (42, 43), applied technical knowledge (41, 44), land suitability and availability (45), and whether it is possible to guarantee animal health and welfare under a range of climatic and geographical conditions (46–48). Remote sensor technology can assist in monitoring animal welfare in grazing systems (49, 50).

The third most important topic dealt with “transport, slaughter and carcass quality” (topic 12). The word stems included in this topic are “slaughter, transport, carcass-, stun-, qualiti-, bruise-, load-, handl-, time, loss-.” The identified literature reflects a tension between the economically driven pressure to increase slaughter speed on the one hand, and the need to minimise financial losses due to bruising, guarantee meat quality, and protect animal welfare and public health on the other (51). Minimising stress and suffering during the pre-slaughter and slaughter phases is an important component of overall cattle welfare, in part also due to societal expectations about how food animals should be killed (52, 53). From an economic perspective, stress and rough handling during transport, lairage and slaughter can compromise carcass quality (54–56) with consequences that can even affect the global market price of beef originating from a specific country (57). One of the most studied aspects in this group of papers concerned the effects of transport on cattle welfare and meat quality, as well as potential strategies to mitigate the associated risks (58–60). In effect, the financial losses due to rough handling during the pre-slaughter phase can be significant (61). In the slaughter phase, stun quality is important to ensure that animals do not regain consciousness until death (62); to reduce health and safety risks for slaughterhouse operators (63); to preserve meat quality, as incorrect stunning causes a surge in blood cortisol and the secretion of heat shock proteins (64). Non-stun slaughter presents specific challenges for animal welfare, such as time to loss of consciousness after the neck cut (65). Some papers investigated ante- and post-mortem animal-based indicators to assess and improve animal welfare on farm and during transport (66, 67).

Although not included in the first three most statistically relevant topics, “castrat-” was among the first ten most important word stems according to the TFIDF analysis and is included in Topic 3 (“pain management”). The castration of male calves or mature bulls is a common practice in many parts of the world and is carried out to facilitate management and prevent unwanted breeding (68). Castration can be carried out upon arrival at the feedlot (69), in some cases together with other painful procedures [e.g., dehorning, branding (70)]. Physiological and behavioural indicators of inflammation and pain can last for days or weeks depending on the method and age of the animal at the time of castration (71, 72). The legal requirements on the provision of pain relief during castration and other painful procedures differ by geographical region and even by country. However, there is increasing awareness on this topic and veterinary codes of practice as well as some industry guidelines

increasingly recommend the use of anaesthesia and/or analgesia, especially when castrating older animals [see (73–75) for some examples]. Research papers on castration included in Topic 3 focused on the availability and potential effectiveness of methods to reduce or eliminate the acute and chronic pain associated with this procedure (69, 76–78). A painless alternative such as immunisation against GnRF (gonadotropin-releasing factor) could be a viable option according to some studies (79, 80). With a view to acknowledging scientific evidence on the acute and chronic pain caused by routine invasive husbandry practices, and to meet societal expectations on the ethical treatment of farmed animals, some authors have proposed a “3S” approach (“suppress, substitute, soothe”), which is the equivalent of the “3R” (“reduce, replace, refine”) principle for animals used in research (81).

Another interesting aspect that emerged from this study is the evolution of different topics over time. Topic n. 2 (“stakeholders’ perceptions”) showed the most pronounced upward trend throughout the years. This topic deals with the attitudes, beliefs, expectations and preferences of different stakeholders (citizens/consumers, veterinarians, farmers, etc.) toward animal welfare and other attributes of beef meat. Such aspects have important implications for the treatment of animals on the one hand, and for the market on the other, since they influence purchase decisions. Consumers’ perceptions of the beef cattle industry—and the livestock industry at large—are constantly changing and can influence willingness to pay for meat produced and marketed in certain ways (82–84). At the same time, farmers’ perceptions and beliefs can have a profound impact on their behaviour, and thus also on animal welfare (85, 86). The same applies to cattle veterinarians (87, 88) and hauliers (89).

The second topic showing the most significant upward trend in terms of papers published was n. 7 (“risk factors for morbidity and mortality”). Papers in this thematic group deal with risk factors for health and mortality in all categories of beef cattle. They are all quite recent, dating from 2002 onwards. The topics that feature most prominently in this thematic group are (a) antimicrobial use and resistance and (b) calf health, with particular reference to factors affecting morbidity and early mortality. The two topics are interdependent: veal calves are typically transported to specialised fattening facilities when still unweaned, sometimes passing via auction markets, and often with insufficient passive immunity (90). Transport over long distances, lairage and handling at auctions, and mixing upon arrival at the fattening facility are all health and welfare challenges (90, 91). As a result, morbidity, mortality and antimicrobial use are still high in the veal sector, and solutions are needed to improve the health and welfare of veal calves, also in light of the global fight against antimicrobial resistance (92–94). Other papers deal with mortality rates in cow-calf and beef fattening operations (95–97). The trend for an increase in the number of publications on these topics is very pronounced, showing a growing interest in improving animal health and welfare also as a means to protect public health.

Text mining with LDA is a methodology that enables researchers to have a good overview of the current state of a given domain or topic and provide indications for further research if relevant, especially when the number of documents to consider is large (10). However, two important limitations

of our study are that the document selection was restricted to peer-reviewed research (Scopus) and to articles written in English or having at least an abstract in English. The choice of Scopus was based on the fact that it is a citational bibliometric database comprising a greater number of scientific journals compared to other databases. However, one limitation of Scopus is that it does not include grey literature, which could have been an interesting source of additional information. Concerning the literature in English, by including in our search criteria all relevant papers with at least an abstract in English, we managed to cover a broad geographical range for our research. However, as already mentioned in the results, geographical areas that normally have a good scientific output in English for other disciplines were less represented in our database. For instance, papers with a first author located in South America, where beef production is economically and numerically important, represent 11% of our database. However, due to the specific challenges associated to the rearing, handling, transport, and slaughter of beef cattle in that geographical area, it is plausible that text mining on papers written in Spanish and Portuguese, as well as in other languages (e.g., German, Chinese, etc.), will reveal different trends and topics. For this reason, an analysis of non-English literature on beef cattle welfare certainly merits to be carried out.

Based on the analysis of the top ten word stems, the most important topics statistically, and the emerging trends, two considerations can be made. The first one is that animal welfare is now perceived as an important component of beef cattle management, and one that can have a positive impact on animal and human health. This is perfectly in line with the OneHealth framework, especially concerning the global fight against antimicrobial resistance (98). The second consideration is that, based on our TM analysis of the literature in English, it would appear that research on beef cattle welfare is increasingly addressing wider societal concerns that, albeit to a variable extent, are part of contemporary global policy discussions on livestock farming. Such concerns include most notably environmental sustainability, but also production efficiency, painful husbandry procedures, as well as the attitudes of various stakeholders toward beef cattle farming.

CONCLUSIONS

Our LDA topic analysis of scholarly articles on beef cattle welfare published in English between 1990 and 2019 shows an increasing scrutiny into the health and welfare of calves, including behavioural aspects. There is also a growing interest in sustainability issues and organic farming practices. Animal welfare during pre-slaughter and stunning, especially during transport, has an impact on meat quality and is therefore also an important research topic. In this specific case, there is a clear convergence of interest between financial gains and improved cattle welfare in the pre-slaughter and slaughter phases. The results indicate a particular focus on the welfare of calves, especially in the veal industry. Research is also increasingly assessing aspects of beef cattle welfare that are interlinked to meat quality, the social and environmental sustainability of the sector in relation to market opportunities, and public health. The

issue of pain relief during castration featured prominently and is likely to become increasingly important as societal scrutiny into the ethical treatment of farmed animals converges with the scientific evidence on the acute and chronic painfulness of routine husbandry practices. The topic showing the most significant increase in popularity in the scientific literature on beef cattle welfare had to do with attitudes of consumers, farmers, and other stakeholders in the beef supply chain and their role in driving higher welfare practices and market opportunities. Another cluster of topics that has shown a marked increase in the literature since 2002 has to do with risk factors for morbidity and mortality, in particular in relation to the high use of antimicrobials in veal calf fattening facilities, which should be reduced by better addressing certain calf health and welfare issues. Although in some cases the focus is still on animal health and production parameters such as meat quality, our analysis shows that research on beef cattle welfare is increasingly incorporating and analysing environmental and societal topics that are relevant for the development of future local and global policies on livestock productions. The identified topics represent a basic source of information that can be used for further and more detailed analyses (e.g., systematic reviews) focussed on specific research themes or geographical areas.

REFERENCES

- Ritchie H. *Meat and Dairy Production*. (2017). Available online at: OurWorldInData.org: <https://ourworldindata.org/meat-production> (accessed on 28 July, 2020).
- Thornton PK. Livestock production: recent trends, future prospects. *Philos Trans R Soc Lond B Biol Sci*. (2010) 365:2853–67. doi: 10.1098/rstb.2010.0134
- Endres MI, Schwartzkopf-Genswein K. 1 - Overview of cattle production systems. In: C. B. Tucker, editor. *Advances in Cattle Welfare*. Duxford Woodhead Publishing Series in Food Science, Technology and Nutrition (2018). p. 1–26.
- Tucker CB, Coetzee JF, Stookey JM, Thomson DU, Grandin T, Schwartzkopf-Genswein KS. Beef cattle welfare in the USA: identification of priorities for future research. *Anim Heal Res Rev*. (2015) 16:107–24. doi: 10.1017/S1466252315000171
- Cozzi G, Brscic M, Gottardo F. Main critical factors affecting the welfare of beef cattle and veal calves raised under intensive rearing systems in Italy: a review. *Ital J Anim Sci*. (2009) 8:67–80. Available at: <https://www.scopus.com/inward/record.uri?eid=2-s2.0-70349970032&partnerID=40&md5=7ddf0f6e6cbfcd94686f36bf4311dade>
- Petherick JC. Animal welfare issues associated with extensive livestock production: the northern Australian beef cattle industry. *Appl Anim Behav Sci*. (2005) 92:211–34. doi: 10.1016/j.applanim.2005.05.009
- Shivley CB, Lombard JE, Urie NJ, Weary DM, von Keyserlingk MAG. Management of preweaned bull calves on dairy operations in the United States. *J Dairy Sci*. (2019) 102:4489–97. doi: 10.3168/jds.2018-15100
- FAWC. *Farm Animal Welfare Committee. "Five Freedoms"*. (2009). Available online at: <https://web.archive.nationalarchives.gov.uk/20121010012427/http://www.fawc.org.uk/freedoms.htm> (accessed on 27 July, 2020).
- Abutridy, JAA. Text mining: principles and applications. *Rev Fac Ing*. (2000) 7:57–62. Available online: <https://www.redalyc.org/articulo.oa?id=11400708>. (accessed on 28 July, 2020).
- Wang S-H, Ding Y, Zhao W, Huang Y-H, Perkins R, Zou W, Chen JJ. Text mining for identifying topics in the literatures about adolescent substance use and depression. *BMC Public Health*. (2016) 16:279. doi: 10.1186/s12889-016-2932-1

DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/**Supplementary Material**, further inquiries can be directed to the corresponding author/s.

AUTHOR CONTRIBUTIONS

EN, FG, and GC contributed to the conceptualisation and methodology of the original draft. BC performed the formal analysis. EN, BC, FG, and GC contributed to writing, reviewing, and editing the manuscript.

ACKNOWLEDGMENTS

The authors wish to thank Reineke Hameleers for her insightful comments and suggestions on the first draft of the article.

SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fvets.2020.588749/full#supplementary-material>

- Park K and Kremer GEO. Text mining-based categorization and user perspective analysis of environmental sustainability indicators for manufacturing and service systems. *Ecol Indic*. (2017) 72: 803–20. doi: 10.1016/j.ecolind.2016.08.027
- Contiero B, Cozzi G, Karpf L, Gottardo F. Pain in pig production: text mining analysis of the scientific literature. *J Agric Environ Ethics*. (2019) 32:40112. doi: 10.1007/s10806-019-09781-4
- Dalla Costa E, Tranquillo V, Dai F, Minero M, Battini M, Mattiello S, et al. Text mining analysis to evaluate stakeholders' perception regarding welfare of equines, small ruminants, and turkeys. *Animals*. (2019) 9:225. doi: 10.3390/ani9050225
- Sebastiani F. Machine learning in automated text categorization. *ACM Comput Surv*. (2002) 34:1–47. doi: 10.1145/505282.505283
- Porter MF. An algorithm for suffix stripping. *Program*. (1980) 14:130–7. doi: 10.1108/eb046814
- Salton G, Buckley C. Term-weighting approaches in automatic text retrieval. *Inf Process Manag*. (1988) 24:513–23. doi: 10.1016/0306-4573(88)90021-0
- Li H, Yamanishi K. Topic analysis using a finite mixture model. *Inf Process Manag*. (2003) 39:521–41. doi: 10.1016/S0306-4573(02)00035-3
- Grün B, Hornik K. Topicmodels: an R package for fitting topic models. *J Stat Softw*. (2011) 40:1–30. doi: 10.18637/jss.v040.i13
- Blei DM, Ng AY, Jordan MI. Latent Dirichlet allocation. *J Mach Learn Res*. (2003) 3:993–1022. Available online at: http://www.cse.cuhk.edu.hk/irwin.king/_media/presentations/latent_dirichlet_allocation.pdf
- Griffiths TL, Steyvers M. Finding scientific topics. *Proc Natl Acad Sci USA*. (2004) 101:5228–35. doi: 10.1073/pnas.0307752101
- Brambell FWR. Systems TC to E into the W of A kept under ILH. *Report of the Technical Committee to Enquire into the Welfare of Animals kept under Intensive Livestock Husbandry Systems*. London: Her Majesty's Stationery Office (1965).
- Harrison R. *Animal Machines*. Cabi (2013). doi: 10.1079/9781780642840.0000
- Bollinger G. Legal protection of animal dignity in Switzerland: status quo and future perspectives. *Anim Law*. (2016) 22:311–96. Available online at: https://www.tierimrecht.org/documents/1353/GieriBolliger_LegalProtectionofAnimalDignityinSwitzerland_in_AnimalLawReview.pdf

24. Broom, D. A history of animal welfare science. *Acta Biotheor.* (2011) 59:121–37. doi: 10.1007/s10441-011-9123-3
25. Gladden N, Ellis K, Martin J, Viora L, McKeegan D. A single dose of ketoprofen in the immediate postpartum period has the potential to improve dairy calf welfare in the first 48 h of life. *Appl Anim Behav Sci.* (2019) 212:19–29. doi: 10.1016/j.applanim.2019.01.007
26. Lind A-K, Lindahl C. *Calving Alert System - a Helping Technique or a Welfare Problem?* 9th Eur Conf Precis Livest Farming, ECPLF 2019, 26 August 2019 through 29 August (2019). p. 385–8. Available online at: <http://urn.kb.se/resolve?urn=urn:nbn:se:ri:diva-40621>
27. Enriquez D, Hötzel MJ, Ungerfeld R. Minimising the stress of weaning of beef calves: a review. *Acta Vet Scand.* (2011) 53:28. doi: 10.1186/1751-0147-53-28
28. Johnsen JF, Ellingsen K, Grøndahl AM, Bøe KE, Lidfors L, Mejdell CM. The effect of physical contact between dairy cows and calves during separation on their post-separation behavioural response. *Appl Anim Behav Sci.* (2015) 166:11–9. doi: 10.1016/j.applanim.2015.03.002
29. Ungerfeld R, Hötzel MJ, Quintans G. Changes in behaviour, milk production and bodyweight in beef cows subjected to two-step or abrupt weaning. *Anim Prod Sci.* (2015) 55:1281–8. doi: 10.1071/AN13453
30. Ungerfeld R, Quintans G, Hötzel MJ. Minimizing cows' stress when calves were early weaned using the two-step method with nose flaps. *Animal.* (2016) 10:1871–6. doi: 10.1017/S1751731116000793
31. Hötzel MJ, Quintans G, Ungerfeld R. Behaviour response to two-step weaning is diminished in beef calves previously submitted to temporary weaning with nose flaps. *Livest Sci.* (2012) 149:88–95. doi: 10.1016/j.livsci.2012.06.029
32. Alvez P, Quintans G, Hötzel MJ, Ungerfeld R. Two-step weaning in beef calves: permanence of nose flaps for 7 or 21 days does not influence the behaviour response. *Anim Prod Sci.* (2016) 56:866–70. doi: 10.1071/AN14643
33. Schwartzkopf-Genswein KS, Booth-McLean ME, Shah MA, Entz T, Bach SJ, Mears GJ, et al. Effects of pre-haul management and transport duration on beef calf performance and welfare. *Appl Anim Behav Sci.* (2007) 108:12–30. doi: 10.1016/j.applanim.2006.11.012
34. Hulbert LE, Cobb CJ, Carroll JA, Ballou MA. The effects of early weaning on innate immune responses of Holstein calves. *J Dairy Sci.* (2011) 94:2545–56. doi: 10.3168/jds.2010-3983
35. Bokkers EAM, Koene P. Activity, oral behaviour and slaughter data as welfare indicators in veal calves: a comparison of three housing systems. *Appl Anim Behav Sci.* (2001) 75:1–15. doi: 10.1016/S0168-1591(01)00175-7
36. Veissier I, Boissy A, dePassillé AM, Rushen J, van Reenen CG, Roussel S, et al. Calves' responses to repeated social regrouping and relocation1. *J Anim Sci.* (2001) 79:2580–93. doi: 10.2527/2001.79102580x
37. Abdelfattah EM, Schutz MM, Lay DC Jr, Marchant-Forde JN, Eicher SD. Effect of group size on behavior, health, production, and welfare of veal calves1,2. *J Anim Sci.* (2013) 91:5455–65. doi: 10.2527/jas.2013-6308
38. Drouillard JS. Current situation and future trends for beef production in the United States of America - a review. *Asian-Australas J Anim Sci.* (2018) 31:1007–16. doi: 10.5713/ajas.18.0428
39. Hocquette J-F, Ellies-Oury M-P, Lherm M, Pineau C, Deblitz C, Farmer L. Current situation and future prospects for beef production in Europe - A review. *Asian-Australas J Anim Sci.* (2018) 31:1017–35. doi: 10.5713/ajas.18.0196
40. Hocquette J-F, Botreau R, Legrand I, Polkinghorne R, Pethick DW, Lherm M, et al. Win-win strategies for high beef quality, consumer satisfaction, and farm efficiency, low environmental impacts and improved animal welfare. *Anim Prod Sci.* (2014) 54:1537–48. doi: 10.1071/AN14210
41. Escribano JA. Beef cattle farms' conversion to the organic system. Recommendations for success in the face of future changes in a global context. *Sustain.* (2016) 8: 572. doi: 10.3390/su8060572
42. Van Loo EJ, Ricke SC, O'Bryan CA, Johnson MG. The future of organic meats. *Org Meat Prod Process.* (2012) 425–30. doi: 10.1002/9781118229088.ch24
43. Escribano AJ. Organic feed: a bottleneck for the development of the livestock sector and its transition to sustainability? *Sustainability.* (2018) 10:2393. doi: 10.3390/su10072393
44. Chander M, Subrahmanyeswari B, Mukherjee R, Kumar S. Organic livestock production: an emerging opportunity with new challenges for producers in tropical countries. *OIE Rev Sci Tech.* (2011) 30:569–83. doi: 10.20506/rst.30.3.2092
45. Ramirez-Aviles L, Sánchez FJ, Aguilar-Pérez C, Ayala-Burgos AJ, Ku-Vera J. *Leucaena leucocephala* feeding systems for cattle production in Mexico. *Trop Grasslands-Forrajés Trop.* (2019) 7:375–80. doi: 10.17138/tgft(7)375-380
46. Nielsen BK, Thamsborg SM. Welfare, health and product quality in organic beef production: a Danish perspective. *Livest Prod Sci.* (2005) 94:41–50. doi: 10.1016/j.livprodsci.2004.11.023
47. Manning J, Cronin G, González L, Hall E, Merchant A, Ingram L. The behavioural responses of beef cattle (*Bos taurus*) to declining pasture availability and the use of GNSS technology to determine grazing preference. *Agric.* (2017) 7:45. doi: 10.3390/agriculture7050045
48. Améndola L, Solorio FJ, Ku-Vera JC, Améndola-Massioti RD, Zarza H, Mancera KF, et al. A pilot study on the foraging behaviour of heifers in intensive silvopastoral and monoculture systems in the tropics. *Animal.* (2019) 13:606–16. doi: 10.1017/S1751731118001532
49. Spiers D, Scharf B, Ann Eichen P. Development of a smart phone application for heat stress detection and mitigation in livestock. In: *2012 IX International Livestock Environment Symposium (ILES IX)* St. Joseph, MI: ASABE (2012). p. 3.
50. González LA, Bishop-Hurley G, Henry D, Charmley E. Wireless sensor networks to study, monitor and manage cattle in grazing systems. *Anim Prod Sci* (2014) 54:1687–1693. Available at: <https://doi.org/10.1071/AN14368>
51. Wigham EE, Butterworth A, Wotton S. Assessing cattle welfare at slaughter - why is it important and what challenges are faced? *Meat Sci.* (2018) 145:171–7. doi: 10.1016/j.meatsci.2018.06.010
52. Hartung J, Nowak B, Springorum AC. 27 - Animal welfare and meat quality. In: Kerry JP, Ledward FM, editors. *Woodhead Publishing Series in Food Science, Technology and Nutrition*. Woodhead Publishing (2012). p. 628–46. doi: 10.1533/9781845695439.4.628
53. Miranda-de la Lama GC, Leyva IG, Barreras-Serrano A, Pérez-Linares C, Sánchez-López E, María GA, Figueroa-Saavedra F. Assessment of cattle welfare at a commercial slaughter plant in the northwest of Mexico. *Trop Anim Health Prod.* (2012) 44:497–504. doi: 10.1007/s11250-011-9925-y
54. Bethancourt-García JA, Vaz RZ, Vaz FN, Silva WB, Pascoal LL, Mendonça FS, et al. Pre-slaughter factors affecting the incidence of severe bruising in cattle carcasses. *Livest Sci.* (2019) 222:41–8. doi: 10.1016/j.livsci.2019.02.009
55. Huertas MS, Kempener EAMR, Van Eerdenburg JCMF. Relationship between methods of loading and unloading, carcass bruising, and animal welfare in the transportation of extensively reared beef cattle. *Animal.* (2018) 8:E119. doi: 10.3390/ani8070119
56. Mendonça FS, Vaz RZ, Vaz FN, Leal WS, Silveira IDB, Restle J, et al. Causes of bruising in carcasses of beef cattle during farm, transport, and slaughterhouse handling in Brazil. *Anim Sci J.* (2019) 90:288–96. doi: 10.1111/asj.13151
57. Petroni R, Bürger KP, González PO, Rossi GAM, Vidal-Martins AMC, Aguilar CEG. Ocorrência de contusões em carcaças bovinas em frigorífico. *Rev Bras Saude e Prod Anim.* (2013) 14:478–84. doi: 10.1590/S1519-99402013000300009
58. Gallo, C., Lizondo, G., Knowles, TG. Effects of journey and lairage time on steers transported to slaughter in Chile. *Vet Rec.* (2003) 152:361–4. doi: 10.1136/vr.152.12.361
59. Wambui JM, Lamuka PO, Karuri EG, Matofari JW, Abey KA. Design of trucks for long distance transportation of cattle in Kenya and its effects on cattle deaths. *Afr J Food.* (2016) 16:1–15. Available online at: <http://www.bioline.org.br/pdf?nd16054>
60. Minka NS, Ayo JO. Effects of different road conditions on rectal temperature, behaviour and traumatic injuries during transportation of different crosses of temperate/tropical breeds of heifers. *Anim Prod Sci.* (2018) 58:2321–8. doi: 10.1071/AN16400
61. Huertas SM, van Eerdenburg F, Gil A, Piaggio J. Prevalence of carcass bruises as an indicator of welfare in beef cattle and the relation to the economic impact. *Vet Med Sci.* (2015) 1:9–15. doi: 10.1002/vms3.2
62. Oliveira SEO, Gregory NG, Dalla Costa FA, Gibson TJ, Paranhos da Costa MJR. Efficiency of low versus high airline pressure in stunning cattle with a pneumatically powered penetrating captive bolt gun. *Meat Sci.* (2017) 130:64–8. doi: 10.1016/j.meatsci.2017.04.007
63. Kline HC, Wagner DR, Edwards-Callaway LN, Alexander LR, Grandin T. Effect of captive bolt gun length on brain trauma and post-stunning hind limb activity in finished cattle *Bos taurus*. *Meat Sci.* (2019) 155:69–73. doi: 10.1016/j.meatsci.2019.05.004
64. Chulayo AY, Bradley G, Muchenje V. Effects of transport distance, lairage time and stunning efficiency on cortisol, glucose, HSPA1A and how they relate with meat quality in cattle. *Meat Sci.* (2016) 117:89–96. doi: 10.1016/j.meatsci.2016.03.001

65. Velarde A, Rodriguez P, Dalmau A, Fuentes C, Llonch P, von Holleben KV, Anil MH, et al. Religious slaughter: evaluation of current practices in selected countries. *Meat Sci.* (2014) 96:278–87. doi: 10.1016/j.meatsci.2013.07.013
66. Grandin T. On-farm conditions that compromise animal welfare that can be monitored at the slaughter plant. *Meat Sci.* (2017) 132:52–8. doi: 10.1016/j.meatsci.2017.05.004
67. Losada-Espinosa N, Villarroel M, María GA, la Lama GCM. Pre-slaughter cattle welfare indicators for use in commercial abattoirs with voluntary monitoring systems: a systematic review. *Meat Sci.* (2018) 138:34–48. doi: 10.1016/j.meatsci.2017.12.004
68. Rault J-L, Lay DC, Marchant-Forde JN. Castration induced pain in pigs and other livestock. *Appl Anim Behav Sci.* (2011) 135:214–25. doi: 10.1016/j.applanim.2011.10.017
69. Coetzee JF, Edwards LN, Mosher RA, Bello NM, O'Connor AM, Wang B, et al. Effect of oral meloxicam on health and performance of beef steers relative to bulls castrated on arrival at the feedlot. *J Anim Sci.* (2012) 90:1026–39. doi: 10.2527/jas.2011-4068
70. Van der Saag D, White P, Ingram L, Manning J, Windsor P, Thomson P, et al. Effects of topical anaesthetic and buccal meloxicam treatments on concurrent castration and dehorning of beef calves. *Animals.* (2018) 8:35. doi: 10.3390/ani8030035
71. Marti S, Meléndez DM, Pajor EA, Moya D, Heuston CEM, Gellatly D, et al. Effect of band and knife castration of beef calves on welfare indicators of pain at three relevant industry ages: II. Chronic pain. *J Anim Sci.* (2017) 95:4367–80. doi: 10.2527/jas2017.1763
72. Mintline EM, Varga A, Banuelos J, Walker KA, Hoar B, Drake D, et al. Healing of surgical castration wounds: a description and an evaluation of flunixin. *J Anim Sci.* (2014) 92:5659–65. doi: 10.2527/jas.2014-7885
73. American Veterinary Medical Association. *Castration and Dehorning of Cattle*. Available online at: <https://www.avma.org/resources-tools/avma-policies/castration-and-dehorning-cattle> (Accessed on 28 July, 2020).
74. National Farm Animal Care Council. *Code of Practice for the Care and Handling of Beef Cattle*. (2013). Available online at: <https://www.nfacc.ca/beef-cattle-code#section4> (accessed on 28 July, 2020).
75. Meat and Livestock Australia. *A Guide to Best Practice Husbandry in Beef Cattle*. Branding, castrating and dehorning (2007). Available online at: <https://futurebeef.com.au/wp-content/uploads/A-guide-to-best-practice-husbandry-in-beef-cattle-Branding-castrating-and-dehorning.pdf>. (accessed on 28 July, 2020).
76. Marti S, Meléndez DM, Pajor EA, Moya D, Gellatly D, Janzen ED, et al. Effect of a single dose of subcutaneous meloxicam prior to band or knife castration in 1-wk-old beef calves: II. Inflammatory response and healing. *J Anim Sci.* (2018) 96:4136–48. doi: 10.1093/jas/sky291
77. Petherick JC, Small AH, Reid DJ, Colditz IG, Ferguson DM. Welfare outcomes for 3- and 6-month-old beef calves in a tropical environment castrated surgically or by applying rubber rings. *Appl Anim Behav Sci.* (2015) 171:47–57. doi: 10.1016/j.applanim.2015.08.018
78. Repenning PE, Ahola JK, Callan RJ, Fox JT, French JT, Giles RL, et al. Effects of pain mitigation and method of castration on behavior and feedlot performance in cull beef bulls. *J Anim Sci.* (2013) 91:4975–83. doi: 10.2527/jas.2012-6061
79. Marti S, Devant M, Amatayakul-Chantler S, Jackson JA, Lopez E, Janzen ED, et al. Effect of anti-gonadotropin-releasing factor vaccine and band castration on indicators of welfare in beef cattle. *J Anim Sci.* (2015) 93:1581–91. doi: 10.2527/jas.2014-8346
80. Gómez JFM, Netto AS, Antonelo DS, Silva J, Sene GA, Silva HB, et al. Effects of immunocastration on the performance and meat quality traits of feedlot-finished *Bos indicus* (Nelore) cattle. *Anim Prod Sci.* (2017) 59:183–90. doi: 10.1071/AN17102
81. Guatteo R, Levionnois O, Fournier D, Guémené D, Latouche K, Leterrier C, et al. Minimising pain in farm animals: the 3S approach - 'Suppress, Substitute, Soothe.' *Animal.* (2012) 6:1261–74. doi: 10.1017/S1751731112000262
82. Yunes CM, Von Keyserlingk AGM, Hötzel JM. Brazilian citizens' opinions and attitudes about farm animal production systems. *Animals.* (2017) 7:75. doi: 10.3390/ani7100075
83. Risius A, Hamm U. The effect of information on beef husbandry systems on consumers' preferences and willingness to pay. *Meat Sci.* (2017) 124:9–14. doi: 10.1016/j.meatsci.2016.10.008
84. Sonoda Y, Oishi K, Chomei Y, Hirooka H. How do human values influence the beef preferences of consumer segments regarding animal welfare and environmentally friendly production? *Meat Sci.* (2018) 146:75–86. doi: 10.1016/j.meatsci.2018.07.030
85. Moggy MA, Pajor EA, Thurston WE, Parker S, Greter AM, Schwartzkopf-Genswein KS, et al. Management practices associated with pain in cattle on western Canadian cow-calf operations: a mixed methods study1. *J Anim Sci.* (2017) 95:958–69. doi: 10.2527/jas.2016.0949
86. Tunstall J, Mueller K, Grove White D, Oultram JWH, Higgins HM. Lameness in beef cattle: UK farmers' perceptions, knowledge, barriers, and approaches to treatment and control. *Front Vet Sci.* (2019) 6:94. doi: 10.3389/fvets.2019.00094
87. Hewson CJ, Dohoo IR, Lemke KA, Barkema HW. Factors affecting Canadian veterinarians' use of analgesics when dehorning beef and dairy calves. *Can Vet J.* (2007) 48:1129–36.
88. Hambleton SYN, Gibson TJ. Study investigating the attitudes and opinions of cattle farmers and veterinarians in the UK on the use of non-steroidal anti-inflammatory drugs (NSAIDs) for post-disbudding analgesia of calves. *Anim Welf.* (2017) 26:323–34. doi: 10.7120/09627286.26.3.323
89. Valadez-Noriega M, Estévez-Moreno LX, Rayas-Amor AA, Rubio-Lozano MS, Galindo F, Miranda-de la Lama GC. Livestock hauliers' attitudes, knowledge and current practices towards animal welfare, occupational wellbeing and transport risk factors: a Mexican survey. *Prev Vet Med.* (2018) 160:76–84. doi: 10.1016/j.prevetmed.2018.09.023
90. Pempek J, Trearchis D, Masterson M, Habing G, Proudfoot K. Veal calf health on the day of arrival at growers in Ohio. *J Anim Sci.* (2017) 95:3863–72. doi: 10.2527/jas2017.1642
91. Renaud DL, Duffield TF, LeBlanc SJ, Haley DB, Kelton DF. Clinical and metabolic indicators associated with early mortality at a milk-fed veal facility: a prospective case-control study. *J Dairy Sci.* (2018) 101:2669–78. doi: 10.3168/jds.2017-14042
92. Jarrige N, Cazeau G, Morignat E, Chantepredrix M, Gay E. Quantitative and qualitative analysis of antimicrobial usage in white veal calves in France. *Prev Vet Med.* (2017) 144:158–66. doi: 10.1016/j.prevetmed.2017.05.018
93. Scott K, Kelton DF, Duffield TF, Renaud DL. Risk factors identified on arrival associated with morbidity and mortality at a grain-fed veal facility: a prospective, single-cohort study. *J Dairy Sci.* (2019) 102:9224–35. doi: 10.3168/jds.2019-16829
94. Bokma J, Boone R, Deprez P, Pardon B. Risk factors for antimicrobial use in veal calves and the association with mortality. *J Dairy Sci.* (2019) 102:607–18. doi: 10.3168/jds.2018-15211
95. Pannwitz G. Standardized analysis of German cattle mortality using national register data. *Prev Vet Med.* (2015) 118:260–70. doi: 10.1016/j.prevetmed.2014.11.020
96. Ring SC, McCarthy J, Kelleher MM, Doherty ML, Berry DP. Risk factors associated with animal mortality in pasture-based, seasonal-calving dairy and beef herds. *J Anim Sci.* (2018) 96:35–55. doi: 10.1093/jas/kx072
97. Mötus K, Viltrop A, Emanuelson U. Reasons and risk factors for beef calf and youngstock on-farm mortality in extensive cow-calf herds. *Animal.* (2018) 12:1958–66. doi: 10.1017/S1751731117003548
98. World Health Organization. One Health (2017). Available online at: <https://www.who.int/news-room/q-a-detail/one-health> (accessed on 11 November, 2020).

Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Copyright © 2021 Nalon, Contiero, Gottardo and Cozzi. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.