



Genetic and Epigenetic Regulation of Immune Response and Resistance to Infectious Diseases in Domestic Ruminants

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KEYWORDS

- Genetic • Epigenetic • Disease • Resistance • Resilience • Tolerance
- Immunocompetence • Ruminants

KEY POINTS

- Infection with a pathogen does not always result in disease, but infectious diseases are the outcome of interactions among 3 factors: host, pathogen, and environment. Several layers of sophisticated interactions between host and pathogens have been a major limiting factor in decoding and identifying the genetic rules of disease resistance.
- Different research groups have used different strategies to dissect this complex network and to understand the genetic rules of diseases resistance. These strategies can be grouped based on the genetic information examined (eg, candidate genes, pedigree-based genetic information, and genome-wide studies) and the phenotypic information available (eg, single-disease, immunocompetence, and reductionist models).
- Recent technological advances are helping researchers to generate big data sets of the host-pathogen-environment interactions. Nonetheless, defining the relevant phenotypes seems to be the main challenge to reveal the genetic blueprint of disease resistance.
- The possibility of negative genetic correlations in resistance to 2 pathogens (eg, intracellular vs extracellular organisms), even those causing the same disease (eg, the many diverse organisms causing bovine mastitis or pneumonia), or negative associations between resistance to a pathogen with important production traits, are other challenges to the single-disease approach, as well as other approaches to selecting for health.

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- An alternative method to scrutinize these complex interactions is to simplify the main interaction network into subsystems that can be examined in detail using in vitro methods. In any subsystems, the genetic control requires the contribution of a smaller number of genes, which may simplify the genetic pathways examined. Although reductionist models can reveal potential genes and pathways important for further examination to host defense, they may not fully reflect the intricacies of in vivo disease resistance.

INTRODUCTION

During disease outbreaks, some individuals in a population are more resistant to infection than others. Resistant individuals may survive, whereas others in the population may die or have less severe signs of disease, or may completely eliminate the infection without showing clinical signs of disease. Infection with a pathogen does not always result in disease, but, when it does, infectious diseases are the outcome of interactions among 3 factors: host, pathogen, and environment.¹⁻³ Each of these factors has been examined in many studies that aimed to reduce the occurrence (increase resistance or resilience) or soften the impact of infection on the host (increase tolerance) (**Box 1**). Among the factors mentioned earlier, the host (or specifically the host immune system) has gained tremendous recognition because of its direct role in protecting the host against pathogens and also the possibility of genetic improvement of this system. However, several layers of sophisticated interactions between host and pathogens have been a major limiting factor in decoding and identifying the genetic rules of disease resistance.⁴ The first layer is the functional complexity of the immune system. The immune system is an intricate network of cells and molecules that applies various strategies to protect the host against a broad range of pathogens.^{5,6} These strategies range from nonspecific physical barriers to specific cytotoxic activity of lymphocytes. Innate defenses classically initiate immune responses; adaptive immune responses follow if innate mechanisms are not successful to eliminate the pathogen. Cells of the innate

Box 1

Resistance, resilience, and tolerance

These terms have varied definitions in the literature, but, for the purpose of this article, the following definitions are applied. Disease resistance is defined as the ability of the host to control the infection passively (eg, absence of a target receptor) or actively (ie, mounting the protective immune responses).⁵ The resistant animals can clear the pathogen, entirely. Resilience is the ability of the host to recover after a disease.¹⁴⁴ Resistance and resilience are closely related but not interchangeable. Resilience is always an active phenomenon, whereas resistance could be passive because of the absence of the target receptor. Resilience can also be defined through the overall performance of the host in the face of general environmental challenges, not only in the face of disease. These challenges include, but are not limited to, weaning, handling, moving to a new feedlot, and disease. Livestock may cope with these challenges via physiologic, behavioral, and also immune responses. Various studies have shown that the performance of immune response at the time of challenge can be a good indicator of the overall resilience of the animal in future.⁴⁹ The current livestock management practices make it possible to measure all components of resilience to predict the overall performance in future. Tolerance is the ability of the host to cope with the presence of the pathogen. Tolerant animals can maintain their production in the face of pathogenic infection.⁵

immune system mainly recognize microbe-associated molecular patterns via pathogen recognition receptors. Following recognition, they attempt to destroy the pathogen, which is followed by sending activating signals to the adaptive immune system. Cells of the adaptive immune system generate pathogen-specific responses. Although immune responses generally follow the pathways mentioned earlier, multifunctionality of cells and molecules, numerous subpopulations of cells, redundancy in responses, and various exceptions to the general rules are a few examples that increase the complexity of immune system.^{4,7} For instance, $\gamma\delta$ T cells, a subpopulation of T cells, belong to the adaptive immune system but can also act like cells of innate defense. These cells are prominent (50%–60% of lymphocytes) in circulating blood in the early life in ruminants, but their population decreases with age (5%–25% of circulating T lymphocytes). Nonetheless, the percentage of $\gamma\delta$ T cells among lymphocytes, even in adult ruminants, is higher than in humans and mice (1%–5%). These cells originate from lymphocyte progenitors but are not antigen (Ag) specific and do not need to recognize Ags in the context of major histocompatibility complex (MHC) molecules. Bovine $\gamma\delta$ T cells have both inflammatory and regulatory activities. Cattle $\gamma\delta$ T cells respond within a few hours of viral infection (similar to innate responses) by producing large amounts of interferon- γ (IFN- γ ; a proinflammatory cytokine) or interleukin (IL)-10 (a regulatory cytokine) following exposure to antigen-presenting cells.^{8,9} The proportion and functional capacity of these cells show individual variation among cattle genetically selected for immune responsiveness.¹⁰

Another layer of immunologic complexity relates to the genetic control of immune responses. Approximately, 20% of the bovine genome (ARS-UCD1.2, ENSEMBL 95) is annotated with the immune response.¹¹ This portion is composed of 5369 genes that are directly involved in mounting immune responses. High-throughput technologies have shown expression of up to 71.4% of the bovine genome in one cell type, the macrophage, after exposure to a pathogen. Compared with the unchallenged control, approximately 245 to 574 genes are differentially expressed.¹² Given the possible nonadditive effects (epistatic and dominance) and epigenetic mechanisms, the genetic control of immune response is astonishingly complex.

A third layer of genetic complexity is caused by the pathogen evolving during an infection. For instance, viral pathogens are well known to escape the immune response through genetic mutations (eg, antigenic shift and drift in influenza viruses) or stabilize themselves in the host via inserting their genome in the host genome, (eg, bovine leukemia virus). This phenomenon potentially results in multistrain infection in 1 host or 1 population during an outbreak.

In this article, recent advances in genetic and epigenetic regulation of immunocompetence and disease resistance in domesticated ruminants are discussed. Moreover, because of the importance of climate change, recent studies of gene-by-environment effects on the regulation of host defense are also discussed.

GENETIC REGULATION OF IMMUNOCOMPETENCE AND DISEASE RESISTANCE

Recent technological advances have helped researchers to generate big data sets of the host-pathogen-environment interactions. Nonetheless, defining the relevant phenotypes seems to be the main challenge in revealing the genetic blueprint of disease resistance.^{13,14} Various research groups have used different strategies to dissect this complex network and to understand the genetic rules of diseases resistance. These strategies can be grouped based on the genetic information (candidate genes,

pedigree-based, and genome-wide studies) and the phenotypic information (single-disease, immunocompetence, and reductionist models) (**Table 1**). The advantages and pitfalls of each strategy are discussed here.

Source of Genetic Information: Candidate Gene, Genome-Wide, or Pedigree

The main difference between a candidate-gene versus a genome-wide approach is the goal of the study: the candidate gene approach is hypothesis driven, whereas the genome-wide approach is discovery based. The hypothesis in the candidate-gene approach is based on a previously established biological link or association between the candidate gene and the health trait. In most cases, the candidate gene has a strong biological and well-defined role in the pathway of pathogenesis or the protective immune response. However, this information, which is the basis of the new hypothesis on the gene of interest, has usually been proved in other species or the magnitude of its effect has not been measured on the specific disease (type I studies) or immune response (type II studies) (see **Table 1**).

Genes of the MHC are arguably the most studied health trait genes in ruminants, as well as other species. One of the first reports of an MHC polymorphism and its association with immune response was from a study in guinea pigs published in 1975.¹⁵ The genetic polymorphism within the bovine MHC known as the bovine lymphocyte antigen (BoLA) system was first reported in 1979.¹⁶ Since then, the association of BoLA with many infectious and metabolic diseases, as well as characteristics of immunity, has been the subject of numerous studies.^{17–23} Despite the extensive studies on BoLA, the findings have rarely been commercially used in breeding programs because of the inverse association with different pathogens and between types of immune responses.²³ An exception was specific BoLA DRB-3 and DQB alleles being used to reduce bovine dermatophilosis from 0.76 to 0.02 in Brahman-Zebu cattle on the island of Martinique.²⁴ This approach worked well because the disease was highly prevalent in a well-contained population of cattle.

The genome-wide association and pedigree-based studies are descriptive studies designed to discover novel associations (type V and VI studies) or to estimate breeding values for individuals in the population (type III and IV studies) (see **Table 1**). The genome-wide genetic information can be combined with pedigree information to increase the reliability of breeding value estimates by accounting for polygene effects. These estimates are known as genomic breeding values,²⁵ which are currently being used by breeding companies, such as the Semex Alliance, to improve accuracy of selection for various traits, including for Immunity+. However, the findings of genome-wide association studies should be validated (eg, using candidate gene studies), and the findings of pedigree-based studies only hold within the population

		Genetic Polymorphism		
		Candidate Gene	Pedigree	Genome-wide
Phenotype	Single Disease	Type I	Type III	Type V
	Immunocompetence	Type II	Type IV	Type VI

The pedigree information can be used alone, or it can be added to the genome-wide study to account for polygenic effects. The pedigree information can also be used to select samples in candidate gene approaches to maximize the diversity of the samples.

or the breed of the studied population, depending on the structure of the sample population.²⁶

In genetic association studies, single nucleotide polymorphisms (SNPs) have been the primary source of genetic information used to identify variation between individuals. Over the past decade, technological advances in sequencing and bioinformatics have provided other sources of genetic information, mainly structural polymorphisms at the genomic, epigenomic, and transcriptomic levels (**Box 2**).²⁷ These structural variants are novel and remain expensive to detect. Therefore, the studies on ruminants using structural polymorphism are limited. Copy number variation (CNV) and splicing variants are two types of novel polymorphisms that have been reported in cattle, water buffalo, sheep, and goat.^{28–31} Studies on the association of the structural variants mentioned earlier with health traits in ruminants are rare. However, there is a limited number of reports on the association of CNVs with bovine clinical mastitis, somatic cell score, and resistance to gastrointestinal nematodes in cattle and resistance to retroviral infection in sheep.^{32–35} The methods to detect structural variants and the challenges in their application in breeding have been reviewed by Bickhart and Liu.³⁶

Source of Phenotypic Information: Single Disease or Immunocompetence

In the single-disease approach, the goal is to identify alleles (type I studies) or to estimate genetic variance components (type III and V studies) by comparing animals classified as resistant, resilient, or tolerant to a disease or syndrome following infection (natural or experimental challenge) with animals classified as susceptible. Any type of investigation of the genetic regulation of immune response and disease resistance needs a large sample size. The sample size required to achieve adequate statistical power can be ambiguously estimated using the predicted number of quantitative trait loci (QTLs) that control the trait, minor allele frequency of QTLs, the threshold to detect QTL effects, effective population size, and estimated environmental effects.^{37,38} Although environmental effects can be controlled or removed in experimental challenges, this type of study in large ruminants (ie, to investigate the genetic control of disease resistance) is less feasible because of the space needed for the containment facility and the high cost to study a large sample population. These limitations have led some researchers to choose case-control studies following natural infection as the most feasible approach to study the genetic control of health traits in ruminants.³⁹ The most critical step in case-control studies is to accurately define the phenotype and assign the samples to the appropriate class. During natural infections, the time of occurrence of the infection, the dose of infection, and any prior exposure to the pathogen are often unknown factors. Therefore, animals might be classified

Box 2

Novel sources of genetic variation

Copy number variation (CNV). CNV is a type of structural variation defined as a segment of DNA (more than 1 kb) with more than 1 copy in the genome. These segments have undergone inversion, deletion, or duplication mutations, but the sequences of these segments are very similar to each other. These segments are called copy number polymorphism when their frequency in the population is more than 1%.¹⁴⁵

Splicing variants. During messenger RNA (mRNA) maturation, intron segments are removed from pre-mRNA, and exons are joined together. Through this process, alternative combination of exons and residues of introns can result in different variants of a mature mRNA, called splicing variants. The association of splicing variants and mastitis has been reported in cattle.^{146,147}

incorrectly. For instance, one individual might be classified as resistant but was not exposed to the pathogen, or the animal might have been previously exposed and developed immunologic memory. These types of errors can potentially introduce prominent experimental “noise,” resulting in an inability to detect QTLs with small effects or rare alleles. However, when the mortality of a disease is very high (eg, highly pathogenetic avian influenza) or the genetic defect is lethal (eg, bovine leukocyte adhesion deficiency [BLAD]) the study noise does not obscure identifying cases and controls. Therefore, identification of genetic regulation at the level of causal mutation is feasible. For instance, BLAD was found to be caused by a mutation on the cluster of differentiation (CD) 18 gene that encodes an adhesion molecule ($\beta 2$ integrin) on the leukocytes surface causing major defect in phagocytosis, chemotactic response, and other normal functions of neutrophils.⁴⁰ In investigating the genetic regulation of diseases with lower mortality or morbidity rate, the study noise must be carefully considered in case-control studies and modified designs are being proposed for complex diseases, such as bovine mastitis.⁴¹

Genetic regulation of resistance to complex diseases, such as clinical and subclinical mastitis, Johne disease, lameness, calf diarrhea, bovine leukosis, bovine tuberculosis, and helminth infestations, are the subject of numerous investigations by using the single-disease approach. The heritabilities of these traits are low compared with production and immune response traits (Table 2). Therefore, the genetic gain will be slow depending on selection intensity.⁴²

Health Trait	Heritability	References
Disease Resistance		
Clinical mastitis	0.02–0.04	Govignon-Gion et al, ¹⁴⁸ 2016; Koeck et al, ¹⁴⁹ 2014
Subclinical mastitis	0.04–0.06	Narayana et al, ¹⁵⁰ 2018
Johne disease	0.04–0.06	Brito et al, ¹⁵¹ 2018; Kirkpatrick & Lett, ¹⁵² 2018
Lameness	0.01–0.09	Chapinal et al, ¹⁵³ 2013; Koeck et al, ¹⁴⁹ 2014
Bovine leukosis	0.08	Abdalla et al, ¹⁵⁴ 2013
Bovine tuberculosis	0.10	Raphaka et al, ⁵¹ 2018
Nematode infestation	0.06–0.23	Passafaro et al, ¹⁵⁵ 2015
Immunocompetence		
Cell-mediated immune response	0.18	Mallard et al, ¹⁵⁶ 2018
Natural antibody	0.27–0.31	de Klerk et al, ⁶⁵ 2018
Specific antibody response	0.46	Emam et al, ¹⁵⁷ 2014
Cellular Traits		
Percentage of CD4+ lymphocytes	0.46	Denholm et al, ⁷³ 2017
Percentage of CD8+ lymphocytes	0.41	Denholm et al, ⁷³ 2017
Percentages of monocytes	0.15	Denholm et al, ⁷³ 2017
Percentages of monocytes	0.42	Denholm et al, ⁷³ 2017
In vitro nitric oxide response of bovine monocyte-derived macrophages	0.78	Emam et al ⁷⁵

Additional challenges to the single-disease approach, as well as other approaches to selecting for health, are introduced by the possibility of negative genetic correlations in resistance to 2 pathogens, even those causing the same disease (eg, the many diverse pathogens that cause bovine mastitis or pneumonia), or negative associations between resistance to a pathogen and important production traits. Mahmoud and colleagues⁴³ investigated the genetic correlation between 9 calf and 14 cow pathogens/diseases. In addition to a strong favorable correlation between resistance to the most common causal agents of mastitis (*Escherichia coli* and *Staphylococcus aureus*), they also reported negative correlations between rotavirus and chorioretinitis, and between *E coli* and daily weight gain in calves.⁴³ Rupp and colleagues²³ reported similar negative associations in relation to mastitis, somatic cell count, and immune response traits. However, other studies have not shown these negative associations.^{44–46} For example, breeding for enhanced immunity in cattle has not been associated with any notable negative impact on production, growth, or reproduction.^{47–50} This lack of association may be caused by overall better health minimizing any decreases in feed intake caused by illness or beneficial shared genes that control a range of fitness traits.

It is possible to define customized breeding programs to increase genetic resistance to disease by combining epidemiologic data on the common pathogens in any geographic location with the results of single-disease approaches. Bovine tuberculosis (bTB) is a significant threat to the cattle industry globally and a distressing problem in the United Kingdom, where the carrier of the pathogen, badgers, are protected by law. Nonetheless, Raphaka and colleagues⁵¹ predicted that the risk of transmission of bTB between the herd mates can be reduced by 50% in 6 generations by selecting the top 25% of bTB-resistant sires (heritability of 0.1). Improving resistance to subclinical mastitis by reducing the somatic cell score in dairy cows has been used for decades. In addition, Scandinavian countries have been selecting for improved resistance to clinical mastitis, and more recently this has been added in Canada and the United States as other examples of the commercially available programs to improve health in dairy cattle.²⁶ In March 2016, Zoetis Inc introduced a Wellness Trait Index (WT\$) on their Bovine Clarifide Plus SNP chip into the United States as part of their genomics program. The index includes genomic information on combined health traits, including mastitis, retained placenta, metritis, displaced abomasum, ketosis, lameness, and polled. In Canada, the Canadian Dairy Network offers a similar combined health index.⁵² The limitation of these indices relates to the accuracy of disease event recording and the low heritability of these traits. In 2018, the Semex Alliance began to offer a genomics test for immunocompetence as part of their Elevate program. Rather than being based on lowly heritable clinical scoring data, the genomics test for immunity is based on direct measurements of the more highly heritable information on both antibody-mediated and cell-mediated immune responses, which control responses to a wide range of bacterial and viral pathogens.

Improvement of immunocompetence (also known as overall immune responsiveness) is another approach to increase resistance against infectious diseases. The rationale behind the immunocompetence approach is the beneficial direct link between the type and magnitude of an immune response with protection of the host. This approach makes sense because the immune system is the body's defense against infectious disease and cancer. The idea of selection based on immune response traits dates back to Biozzi and colleagues⁵³ in 1972 and the mouse model they generated. These mice are currently known as the ABH strain.⁵⁴ Biozzi selected these mice for many generations for increased antibody and decreased cellular responses to investigate the genetic regulation of susceptibility and resistance to

infectious diseases. In livestock, the idea was first introduced in the late twentieth century and continued research led to the first commercially available health index for dairy cattle in 2013, based on their immunocompetence.⁶ Improving the overall immune responsiveness provides the opportunity for resistance to a broad range of pathogens when heritable, well-balanced, and broad-based aspects of immunity are contained within the selection index. Simultaneously, responses to vaccines have been reported to improve, and, in ruminants, their colostrum contains higher amounts of immunoglobulin (Ig) to protect their newborns.^{48,6,55} Cows classified as having superior immunocompetence have a lower occurrence of various diseases, such as mastitis, metritis, and pneumonia.⁶ This finding is true both in research and commercial application.⁵⁶ Also, as mentioned earlier, this approach has not been found to adversely affect production or reproductive traits of dairy cattle.^{56,57}

The main challenge in the immunocompetence approach is to develop methods to measure immune responses that can reflect the overall performance of this complex system. The immune system is composed of an integrated network of innate and adaptive immune responses. The antibody-mediated and cell-mediated immune responses are the effector mechanisms of the adaptive immune system. Measuring serum antibody as the indicator of antibody-mediated immune response is accurate, inexpensive, and technically simple. However, defining an index to measure antibody-mediated and cell-mediated immune responses, as well as capture innate cellular responses, is much more challenging. The cell-mediated response can be evaluated by measuring T-cell cytotoxicity, interferon- γ , delayed-type hypersensitivity (DTH), or other measures of T-cell effector functions.^{58,59} Although there are various methods to capture these T-cell responses, they are generally not as simple, cost-effective, or as accurate as measuring antibody. One of the advantages of measuring DTH is that it involves a variety of important leukocyte populations (neutrophils, macrophages, dendritic cells, and natural killer cells) from the innate system, as well as T and B lymphocytes from the adaptive immune system that are involved in mounting the DTH response.⁶⁰ Not surprisingly, the genetic control of this response is complex and involves many genes on various chromosome. The results of genome-wide association studies of serum antibody and DTH responses in dairy cattle show the differences in the genetic control of these two responses. Two major QTLs on chromosomes 21 and 23 are associated with antibody response to a type II antigen, whereas associations of SNPs with DTH are scattered over the entire bovine genome. Both traits are under polygenic control, but the nature of that control differs. To date, studies indicate that the heritability of antibody-mediated response is about 2-fold larger than the heritability of DTH response in dairy Holsteins⁵⁸ (see [Table 2](#)). This difference may simply be caused by the large number of leukocyte populations involved in DTH or the difficulty of accurately measuring this response in vivo. Nonetheless, the heritability estimates for both of these immune response traits are moderately high at 0.18 to 0.46, which is more than those for clinical scores of diseases. This difference is partly caused by the immune system directly controlling host defense and disease outcome, whereas clinical scores are an indirect indicator of the host response. For this reason, in 1999 Wilkie and Mallard⁶¹ proposed that heritable adaptive immune responses measured after exposure to carefully selected nonpathogenic antigens can reflect general immunocompetence and be used in a selection index based on estimated breeding values to improve animal health ([Fig. 1](#)). From a technical point of view, this method is similar to a highly controlled experimental challenge because the background response, the dose of antigen, and the time duration from exposure to the test antigens to sample collection are fully controlled. Moreover, the added benefit of this test method compared with an experimental disease challenge is that

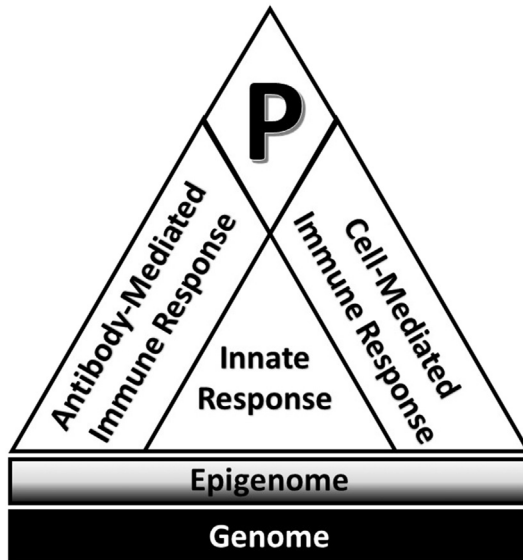


Fig. 1. In 1999, Wilkie and Mallard⁶¹ proposed that the overall performance of the immune system (phenotype [P]) is shaped by adaptive immune responses, including cell-mediated immune responses and antibody-mediated immune responses. Because innate responses initiate adaptive immune responses, adaptive immune responses can reflect the performance of innate defenses. Furthermore, all of these responses are coded by immune response genes in the host genome that can be influenced by the epigenome. (Adapted from Wilkie B, Mallard B. Selection for high immune response: an alternative approach to animal health maintenance? *Vet Immunol Immunopathol.* 1999;72(1-2):231-235. <http://www.ncbi.nlm.nih.gov/pubmed/10614513>; with permission.)

there is no need for a containment facility because of the nonpathogenic characteristics of the test antigens.⁶² These controlled factors result in high heritability of these health traits (see [Table 2](#)).

Measuring innate host defense can be more challenging than adaptive immune responses because of their varied mechanisms of action, broad specificity, and assorted tissue locations. Measuring innate cellular responses *in vivo* is very difficult, except for some limited measures in birds (eg, measuring macrophage phagocytosis using carbon clearance test).^{63,64} In contrast, humoral innate responses, such as natural antibodies (NABs), are simpler to measure, and their roles in disease resistance have been well studied in ruminants. NABs, produced mainly from B1 lymphocytes, are present in the body before exposure to any foreign antigens and are classified as one of the humoral innate responses.⁶⁵ NAB provides one of the first barriers to infection. Binding to the pathogen, activating the complement system, and facilitating phagocytosis are the effector mechanisms that are mediated by NAB.⁶⁶ Studies on the genetic regulation of IgM and IgG NABs have shown these as heritability traits in dairy cattle (see [Table 2](#)). The genes that control specific adaptive antibody responses versus NAB differ, indicating that these are distinct traits, each making unique contributions to defense of the host.^{65,67}

Reductionist models

As mentioned previously, disease pathogenesis is the outcome of a highly complex set of interactions between host, pathogen, and environment. An alternative method

to scrutinize these complex interactions is to simplify the main interaction network into subsystems that can be examined in detail using *in vitro* methods. In any subsystems, genetic control requires the contribution of a smaller number of genes. These genes and their mechanisms of action can, in some cases, be studied in fully controlled *in vitro* environments in which infectious dose and virulence of the pathogen are set by the investigator.⁶⁸ Therefore, the chance of detecting QTLs with smaller effects or discovering causal mutations is higher than with other approaches. The other advantage of the reductionist model is the smaller sample size needed for these types of studies.³⁷ The downside of using reductionist models to study the complexity of disease resistance is that focusing on a single subsystem *in vitro* might be misleading. These *in vitro* models may not represent the *in vivo* condition, or their effect on the *in vivo* system might be small. Therefore, the results of the reductionist models should subsequently be evaluated on the *in vivo* outcome of host-pathogen-environment interactions.

The reductionist concept to study the genetic control of disease resistance was first introduced in 2009 by Ko and colleagues⁶⁹ and later was reviewed in a 2014 publication entitled “The Marriage of Quantitative Genetics and Cell Biology: A Novel Screening Approach Reveals People Have Genetically Encoded Variation in Microtubule Stability.”⁶⁸ Dennis Ko and his colleagues have developed an *in vitro* model, called high-throughput human *in vitro* susceptibility testing (Hi-HOST), to screen the response of B lymphocytes followed by a genome-wide association study to investigate host-pathogen interactions. Using the Hi-HOST model, in 2017 they discovered an association between *VAC14*, a gene responsible in the metabolism of phosphoinositide, and resistance to *Salmonella enterica* serovar Typhi.⁷⁰ In 2018, an independent study on an African population found the association of the same gene with bacteremia in children.^{71,72} These findings represent the potential of the reductionist approach to reveal the genetics rules in resistance to infectious disease.

In dairy cows, the genetic regulation of blood leukocyte proportions was first reported by Denholm and colleagues⁷³ in 2017, who found the heritability of the percentage of cells from the myeloid and lymphoid lineage in bovine blood ranged from 0.18 to 0.81. However, the researchers did not find any significant associations between these cellular proportions and the infectious diseases they examined.⁷³ Emam and colleagues⁷⁴ studied the effect of host genetics on the function of bovine monocyte-derived macrophages (MDMs) in response to *E coli* and *S aureus*, using a cellular immunogenomic approach in 2018. Using a highly controlled *in vitro* culture system, they showed a pedigree-based heritability of 0.776 for *in vitro* nitric oxide production by MDMs against *E coli*.⁷⁵ The genome-wide association study on this cellular trait revealed the association of 8 SNPs on chromosome 4, 5, 6, 9, and 27 describing 78% of the phenotypic variation.⁷⁶

Results from reductionist models should be confirmed using other experimental systems. These confirmatory studies can be association studies in an independent population or investigation using genome editing or other appropriate technologies. Inducing disease resistance in ruminants using gene editing has previously been reported. Resistance to *S aureus* in a transgenic cow expressing lysostaphin in epithelial cells of the mammary gland is an example of this approach.⁷⁷ At present, new technologies with high efficiency and accuracy in inserting, deleting, or substituting single nucleotides are available. Clustered regularly interspaced short palindromic repeats-associated protein 9 (CRISPR/Cas9) is a tool to edit a specific sequence of the genome with single nucleotide accuracy. Some research groups have reported the successful application of this method in cattle. However, the publications are yet to come because of the long generation interval in cattle and the novelty of the

technology.⁷⁸ The reductionist models in conjunction with genome editing methods will likely provide the foundation of genetically resistant ruminants in future.

EPIGENETIC CONTROL OF THE IMMUNE SYSTEM IN DOMESTICATED RUMINANTS

Epigenetics is defined as the control of gene expression by mechanisms that do not change the underlying DNA sequence.^{79,80} The epigenome can be influenced by environmental factors, including diet, stress, hormones, pathogens, toxins, and drugs, resulting in both permanent and reversible changes to gene expression. The epigenome encompasses all epigenetic modifications, including DNA methylation, histone modifications, and microRNA (miRNA) regulation, which are among the major regulatory elements that dictate chromatin accessibility and gene transcription. The immune system is dynamic and possesses the ability to respond to infection and other stressors while also regulating its own response. Epigenetic modifications regulate gene expression, which drives adaptive and innate immune cell phenotypes, establishing cell memory, cell polarization, and regulation of the immune response.⁸¹

DNA Methylation

The DNA methylome of the ruminant immune system is influenced by species,⁸² tissue and immune cell types,^{83–91} disease state,^{85,92} stimulation,⁹³ age,⁹⁴ and physiologic event.^{83,87,88,93,95–97} Studies investigating the DNA methylation levels and profiles of immune response genes have been performed on immune-associated tissues,⁸⁹ specific immune cells,^{85,97–99} as well as other non-immune-related tissues^{83,86,87,100} in domesticated ruminants species. Studies investigating DNA methylation and the immune system have reported on both the methylation of individual cytokine genes^{93,99} and the global DNA methylome.⁹⁸ In cattle, CD4+ T-cell polarization depends on expression and secretion of cytokine genes including IFN γ and IL4. Expression and secretion of cytokines by isolated CD4+ T cells showed decreased DNA methylation at the promoter regions of IFN γ and IL4.^{93,99} In addition, differential DNA methylation was observed at transcription factors GATA3 and RORC in alveolar macrophages of cattle infected with *Mycobacterium bovis*.⁹⁸ In agreement with this observation, examination of MHC-I revealed that DNA methylation of MHC-associated CpG islands are associated with downregulation of MHC-I.¹⁰¹

Differentially methylated regions (DMRs) have been identified in cattle using global methylation analysis technologies on different types of immune cells, which are summarized in **Table 3**.^{82,85,94,97,98} Evaluation of global DNA methylation can reveal regions of the genome that change in response to a treatment, or that change in a tissue-specific manner. DMRs can differ depending on factors such as the tissue type, comparison of treatments, environmental impacts, and infection. As such, care must be taken when choosing the type of tissue or cell type isolated for DNA methylation analysis. Furthermore, the time of sample collection could affect the presence of DNA methylation or intermediary DNA methylation.⁸⁵ Age and diet are also well-known factors that affect global DNA methylation and therefore DMRs.^{88,90,91,94} Examination of global DNA methylation in non-immune-related tissues showed an association between decreased DNA methylation at immune-related genes, including TLR4, and increased chromatin accessibility and gene expression in cattle that were fed high-concentrate diets compared with their counterparts that were fed a low-concentrate diet.⁹⁵ Overall DNA methylation is associated with transcriptional regulation in ruminants and thus can influence immune cell phenotype and function.

Cell Type	Method	Comparison	Number of DMRs	References
CD4+ T lymphocytes	Reduced-representation bisulfite sequencing	<i>M bovis</i> -infected cattle vs noninfected cattle	765 DMR infected vs noninfected cattle	Doherty et al, ⁹⁸ 2016
Fibroblast	Reduced-representation bisulfite sequencing	Difference between 5 mo and 16 mo of age stimulated with lipopolysaccharide	14,094 DMR (5065 gene regions, 1117 promoters, 1057 gene exons, 2891 gene introns)	Korkmaz & Kerr, ⁹⁴ 2017
Peripheral blood mononuclear cell	Whole-genome MeDIP-seq	High milk yield and average milk yield	72 DMR high vs average milk yield 252 DMR herd environment	DeChow & Liu, ⁹⁷ 2018
Alveolar macrophage	Whole-genome bisulfite sequencing	<i>M bovis</i> -infected cattle vs noninfected	0 DMR between infected and noninfected	O'Doherty et al, ⁸⁵ 2019
Blood cells	Reduced-representation bisulfite sequencing	Creole cattle vs Iberian breeds	334 DMR	Sevane et al, ⁸² 2019

Abbreviation: MeDIP-seq, methylated DNA immunoprecipitation sequencing.

Histone Modifications

There are limited studies that report on histone modifications in domesticated ruminants, especially in the context of the immune response. Genome-wide assessment of the gene repressor marker, H3K27me3,¹⁰² in bovine peripheral blood lymphocytes identified that this epigenetic mark is predominantly found 2 kb upstream of transcription start sites (TSSs) and in introns.¹⁰³ The presence of H3K27me3 at TSSs was generally associated with transcriptional repression for most genes.¹⁰³ He and colleagues,¹⁰⁴ investigated the impact of *S aureus* on H3K27me3 levels in blood mononuclear cells in cattle.¹⁰⁴ Most H3K27me3 was found to be intergenic and 20 kb upstream of TSSs, suggesting it is associated with regulatory factors outside the promoter region, such as enhancers.¹⁰⁴ There was a negative correlation between H3K27me3 and gene expression. In this case, the TSS was a key area of regulation for genes that function in immune-related processes in innate and adaptive immune responses when comparing cows with mastitis with healthy cows.¹⁰⁴ More research is needed to better understand the regulatory role of histone modifications and the histone code in bovine species and how they relate to immunity and immune function.

BOVINE COLOSTRUM AND MILK EXOSOMAL microRNAs

MicroRNAs are abundant in bovine colostrum and milk either free or enclosed within exosomes.^{105–107} Notably, immune-related miRNAs are highly expressed in milk, particularly in colostrum, suggesting they are crucial for mammary gland immune regulation as well as promoting development of the calf gut mucosal immune system.¹⁰⁸

Studies from the Mallard laboratory assessed the bioactivity of bovine colostrum and milk exosomes containing miRNA on gut health. Purified exosomes were noted to have typical phenotypic features similar to those in other body fluids¹⁰⁹ based on size (20–100 nm) and protein markers essential for their interaction with host cells.^{110,111} Fluorescently labeled exosomes cocultured with human intestinal epithelial (Caco-2 cells) were taken up and visualized in the vicinity of the nucleus of cultured cells at 2 and 24 hours.¹¹¹ Furthermore, colostrum and milk exosomes cocultured with Caco-2 cells were not only noncytotoxic but enhanced cell viability using methylthiazolotetrazolium (MTT) cell proliferation/viability assay. Although both colostrum and milk seem to support Caco-2 cell viability for up to 72 hours, MTT activity was significantly ($P < .0001$) higher in cells cocultured with milk compared with those with colostrum. Furthermore, differences in Caco-2 cells' metabolic activity cocultured with exosomes from cows with different immune response phenotypes was observed. Specifically, metabolic activity after coculture with colostrum and milk exosomes from high immune response cows was significantly greater than those with low immune response exosomes ($P = .0198$). Of note, classification of those cows as high or low immune response was based on estimated breeding values using the patented High Immune Response (HIR) technology. Viability of Caco-2 cells cocultured with either colostrum or milk exosomes from high immune responder cows was significantly greater ($P < .0024$ and $P < .0048$) than that of low responders at 72 hours. A similar observation was reported in porcine milk exosomes.¹¹²

High-throughput next-generation sequencing of milk exosomal miRNA from average immune responder cows identified 680 mature miRNAs.¹¹⁰ This study was the first to profile bovine exosomal miRNA isolated by differential ultracentrifugation and report their abundance compared with those identified in bovine milk exosomes by microarray ($n = 79$ ¹⁰⁵) and in porcine milk exosomes ($n = 218$,¹¹³ $n = 491$,¹¹⁴ and $n = 234$ ¹¹⁵). Similar to the aforementioned studies, immune-related miRNAs, such as miR-148a, let-7 family, miR-21, and miR-26, were highly expressed in the study of cows classified based on their immune response phenotypes.

Important immune-related miRNAs (including miR-148a, miR-155, miR-21, miR-26a, and miR-29b) were also confirmed by quantitative reverse transcription polymerase chain reaction in colostrum and milk exosomes with significantly ($P < .05$) higher expression of miR-155 in colostrum compared with milk exosomes. Further, miR-155, miR-21, miR-26a, and miR-29b were differentially expressed among high and low immune responder cows.¹¹⁰

GENE BY ENVIRONMENT EFFECTS ON REGULATION OF IMMUNOCOMPETENCE OF DOMESTICATED RUMINANTS

The environmental component of host-pathogen-environment interactions that dictate disease profiles is discussed next. This area of research is important and topical because the changing climate is affecting livestock health and welfare directly through increased environmental temperatures and drought¹¹⁶ and indirectly through ecosystem changes that alter the availability of feed resources and the distribution or epidemiology of animal diseases.^{117,118} This article defines heat stress (HS) and resilience to climate change and how these factors relate to immunocompetence in domestic ruminants.

Because ruminants are endothermic homeotherms, they can maintain a physiologic body temperature within a certain ambient thermal neutral zone through passive cooling mechanisms (conduction, convection, and radiation).¹¹⁹ However, when the surrounding ambient temperature is greater than an animal's thermal neutral zone, the

animal must expend energy and mobilize body reserves to maintain eutheria through active cooling (sweating and panting).^{119,120} In general, cold ambient temperatures are manageable through protective shelters, increasing body size, insulation, and the heat generated through metabolism.^{119,120}

Resilience can be defined as the ability of a species to survive and recover from a perturbation.¹²¹ Animals with greater resilience to HS are able to maintain eutheria for longer through heat dissipation before becoming physiologically compromised.^{118,122–124} Resilience depends on multiple factors, including region (adaptability), species, breed, sex, and productivity.^{117,119} For example, among cattle, an increase in body temperature under HS was less pronounced in Brown Swiss compared with Holstein cows, suggesting that Brown Swiss are more resilient.^{125,126} Among dairy animals, goats were identified as the most adapted species to HS in terms of production, reproduction, and disease resistance.^{127,128} The question of whether animals more resilient to climate HS can be identified within breed and whether they are more resistant to disease is an area of emerging research.

The temperature-humidity index (THI) has been widely used as an indicator of HS in livestock.^{129–131} THI is calculated by combining ambient temperature and humidity (see **Box 1**).¹³² Various THI HS thresholds have been estimated, depending on species, breed, and region. For example, estimated THI thresholds for HS in Holstein cows range from 60 (which could correspond with a temperature of 21°C and a relative humidity of 62%; see **Box 1** for calculation of THI) for Holsteins in Germany¹³³ to 78 for Holsteins in a US subtropical environment.¹³⁴ The THI threshold for HS is likely to be higher for animals with lower production rates and for nonlactating animals.¹³² Curtis and colleagues¹³⁵ used rumen temperature and feed intake to estimate a THI HS threshold of 75.5 for black angus feedlot cattle. Given these diverse ranges for THI thresholds, it is important for studies in various geographic locations to determine the relevant THI thresholds for each study.

Livestock are likely to experience days during the summer months when the THI exceeds their THI HS threshold. HS intensifies when the THI exceeds the threshold for consecutive days because the animal has reduced opportunity to dissipate body heat at night.¹³⁶ As an example, analysis of climatic data from a temperate region in southern Ontario, Canada, revealed that livestock frequently experience days, often consecutively, on which the THI HS threshold was likely exceeded (**Fig. 2**).

Stress Responsiveness and Immunocompetence

The environment plays a key role in the nature and outcome of host-pathogen interactions,¹³⁷ and it is therefore important to improve understanding of how climate extremes affect animals' responses to pathogens. Furthermore, climate change could induce shifts in the spread and types of diseases to which livestock are exposed.¹¹⁸ The health and welfare of animals as the climate changes will be dictated in part by their resilience to extreme temperatures as well as their natural resilience to infectious agents. As such, it is desirable to select for animals with both enhanced ability to resist disease^{49,55,138,139} and superior resilience to HS.

There is evidence for favorable associations between disease resistance and stress responsiveness in livestock.¹²⁴ Recently, Aleri and colleagues⁴⁹ showed a favorable and significant association between a preferred response to stress and above-average immune competence in Holstein-Friesian and Holstein-Friesian × Jersey heifers. For example, heifers with above-average immune competence had lower serum cortisol concentrations compared with their below-average counterparts, suggesting that they had enhanced ability to cope with management-induced stress.⁴⁹ Reduced cortisol production in response to stress is desirable because high

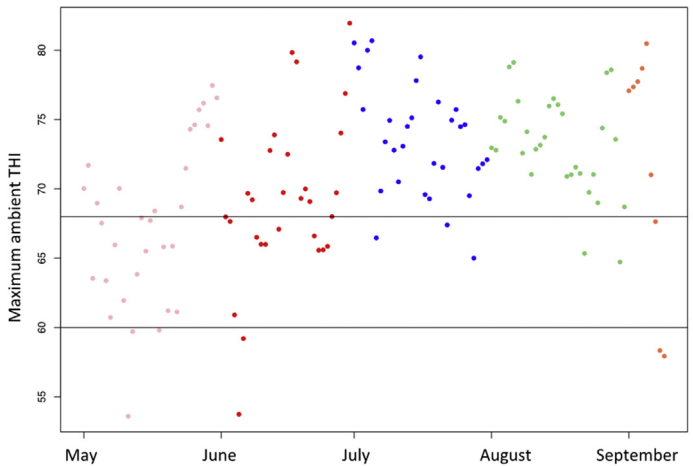


Fig. 2. The THI calculated for the summer months (May to September) of 2018 at a temperate region in southern Ontario, Canada. Suggested THI heat shock thresholds for dairy cows are indicated. ^a Estimated by Zimbelman and colleagues.¹³² ^b Estimated by Brügemann and colleagues.¹³³ (Data from Zimbelman RB, Rhoads RP, Collier RJ, Duff GC. A re-evaluation of the impact of temperature humidity index (THI) and black globe humidity index (BGHI) on milk production in high producing dairy cows. *Proc Southwest Nurr Man Conf.* 2009;(January):158-169 and Brügemann K, Gernand E, von Borstel UU, König S. Genetic analyses of protein yield in dairy cows applying random regression models with time-dependent and temperature x humidity-dependent covariates. *J Dairy Sci.* 2011. <https://doi.org/10.3168/jds.2010-4063>.)

concentrations can suppress immune function and decrease the ability to cope with stress.^{140,141} Because HS also results in increased serum cortisol concentrations,^{142,143} it will be informative to investigate associations between immune competence and resilience to HS. For this reason, the Mallard laboratory is investigating the connection between cattle classified based on estimated breeding values of immune responsiveness and their response to HS. Preliminary results indicate substantial individual variation in response to both *in vivo* and *in vitro* HS in Holsteins, as well as beef cattle of mixed breeds. Knowledge of the genetic link between resilience to HS and immunocompetence would provide scope for breeding animals that are more resilient to HS and disease for a future with predictions for increased frequency and duration of HS events and changes to the distribution or epidemiology of pathogens.

SUMMARY

Disease resistance has a complex phenotype because of the dynamic interaction between host, pathogen, and environment. Discovering the mechanisms of how the genome shapes this phenotype is an exceptionally complex process with more than 5000 genes controlling host defense. Various strategies that have been used by researchers are limited. Although new technologies and bioinformatic methods are promising to collect and analyze much more complex data, the bottleneck of the investigation seems to be at the starting point: how to accurately translate a biological phenomenon (disease resistance) to a parsable data set. Recently, after decades of researches on the genetic regulation of disease resistance, some technologies became commercially available. However, these technologies are mainly based on association studies and, in some cases, the heritabilities are very low. Therefore, the

genetic gain might be limited because of the loss of association over generations or the low heritabilities. Novel strategies and sources of data are required to deepen the current study beyond association, free from study noise, to discover the causal mechanisms with near-perfect heritability to overcome these limitations. Reductionist models, structural variants, and epigenomic research are all examples of novel approaches and source data in an attempt to show the genetic blueprint of disease resistance. It should also be noted that livestock production and health will likely face new challenges with climate change. Emerging or reemerging diseases, or the compromised performance of the current traits under environmental stress, such as HS, are just a few examples of the potential future challenges. All these factors warrant further investigation to identify the genetic regulation of disease resistance to improve livestock health now, as well as to be prepared for future challenges.

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