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Associations of natural variation in the CD163 and other candidate genes on host response of nursery pigs to porcine reproductive and respiratory syndrome virus infection

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Abstract

Pigs with complete resistance to porcine reproductive and respiratory syndrome (PRRS) virus (PRRSV) have been produced by genetically knocking out the CD163 gene that encodes a receptor of the PRRSV for entry into macrophages. The objectives of this study were to evaluate associations of naturally occurring single nucleotide polymorphisms (SNPs) in the CD163 gene and in three other candidate genes (CD169, RGS16, and TRAF1) with host response to PRRSV-only infection and to PRRS vaccination and PRRSV/porcine circovirus 2b (PCV2b) coinfection. SNPs in the CD163 gene were not included on SNP genotyping panels that were used for previous genome-wide association analyses of these data. An additional objective was to identify the potential genetic interaction of variants at these four candidate genes with a mutation in the GBP5 gene that was previously identified to be associated with host response to PRRSV infection. Finally, the association of SNPs with expression level of the nearby gene was tested. Several SNPs in the CD163, CD169, and RGS16 genes were significantly associated with host response under PRRSV-only and/or PRRSV/PCV2b coinfection. The effects of all SNPs that were significant in the PRRSV-only infection trials depend on genetic background. The effects of some SNPs in the CD163, CD169, and RGS16 genes depend on genotype at the putative causative mutation in the GBP5 gene, which indicates a potential biological interaction of these genes with GBP5. In addition, genome-wide association results for the PRRSV-only infection trials revealed that SNPs located in the CDK5RAP2 or MEGF9 genes, near the TRAF1 gene, had suggestive effects on PRRS viral load, which indicates that these SNPs might contribute to PRRSV neuropathogenesis. In conclusion, natural genetic variants in the CD163, CD169, and RGS16 genes are associated with resistance to PRRSV and/or PCV2b infection and appear to interact with the resistance quantitative trait locus in the GBP5 gene. The identified SNPs can be used to select for increased natural resistance to PRRSV and/or PRRSV-PCV2b coinfection.

Key words: CD163 gene, CD169 gene, disease resistance, genetics, porcine reproductive and respiratory syndrome, swine

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Abb	reviations	
1100	c v ia aono	

dpi	days post infection
dpv	days postvaccination
FDR	false discovery rate
LD	linkage disequilibrium
PCV2b	porcine circovirus 2b
PHGC	PRRS Host Genetics Consortium
PRRS	porcine reproductive and respiratory
	syndrome
PRRSV	porcine reproductive and respiratory
	syndrome virus
QTL	quantitative trait loci
SNP	single nucleotide polymorphism
TCID50	tissue culture infectious dose

Introduction

Porcine reproductive and respiratory syndrome (PRRS) has caused dramatic economic losses in the swine industry throughout the world since the 1990s. The causative agent is an enveloped, positive, single-stranded RNA virus from the family Arteriviridae (Snijder et al., 2013) that has restricted tropism for porcine host cells of monocyte/macrophage origin. Pigs are the only known natural host of the PRRS virus (PRRSV; Lunney et al., 2016). The PRRS Host Genetics Consortium (PHGC) was established in 2007 to investigate the genetic basis of host response to PRRSV infection using large experimental infection studies of nursery pigs (Lunney et al., 2011). Results from the PHGC showed that the response of pigs to PRRSV infection is moderately heritable but highly polygenic (Waide et al., 2017), except for genotype at the guanylate binding protein 5 (GBP5) gene or region (Koltes et al., 2015), which was shown to have a major effect on both viremia and weight gain following PRRSV infection in nursery pigs (Boddicker et al., 2012, 2014a, 2014b). To our knowledge, no pigs with complete natural resistance to PRRS have been identified. In 2016, however, CD163 gene knockout pigs were generated and found to be completely resistant to infection with PRRSV isolate NVSL 97-7895 (Whitworth et al., 2016). The CD163 gene is a member of the scavenger receptor cysteine-rich (SRCR) superfamily and is a cellular receptor for PRRSV (Calvert et al., 2007). The CD163 knockout pigs have a nonfunctional SRCR domain 5 (SRCR5) from exon 7, which demonstrates that SRCR5 in porcine CD163 is essential for PRRSV to infect macrophages (Burkard et al., 2017). Ma et al. (2017) found that a single base pair edit at position 561 in CD163 SRCR5 causes an arginine to alanine substitution that prevents PRRSV binding to the CD163 receptor during virus invasion. The CD163 receptor consists of nine extracellular SRCR domains and two proline-serine-threoninerich domains. After deletion of SRCR 4-6 of CD163, the CD163 mutants were only expressed in HEK293T cells, but not on the cell surface, and thus none of the resulting HEK293T cells were infected by PRRSV (van Gorp et al., 2010). After deletion of SRCR 7-9 of CD163, none of the HEK293T cells were infected by PRRSV, although surface and intracellular expression of CD163 mutants were identified (van Gorp et al., 2010).

Johnsson et al. (2018) conducted pooled sequencing of the exons of the CD163 gene of 35,000 pigs with different genetic backgrounds, and whole-genome sequencing of 3 pigs, with the aim to identify natural mutations in the CD163 gene that may result in resistance of pigs to PRRSV infection, but no potential natural knockout variants of the CD163 gene were found. However, Ren et al. (2012) identified three single nucleotide polymorphisms

(SNPs) in the CD163 gene, of which two, c.2592A>G (also named A2552G) and c.2740C>A (also named C2700A), were associated with risk of PRRSV infection following a natural outbreak in a population of 524 approximately 1-y-old crossbred pigs (Duroc × [Landrace × Large White]). Using data from 47 (Landrace × Yorkshire) × Duroc pigs that were experimentally infected with the JA142 PRRSV strain, Lim et al. (2018) found significant associations of several SNPs in the CD163 gene with PRRSV viremia and weight gain at 21 days post infection (dpi), and with average viremia at 3, 14, 21, and 28 dpi, including the c.2509G>C, c.2638A>G, and c.3534C>T polymorphisms. The latter SNP is located in the 3'-UTR region of the CD163 gene and was also found by Wang et al. (2012) to be significantly associated with IgG content in blood in a population of 128 healthy pigs from different breeds and crosses. The two SNPs in the CD163 gene that were identified by Ren et al. (2012) were, however, not found to be significant in the study of Lim et al. (2018). Interestingly, Lim et al. (2018) found both the c.2509G>C and the c.3534C>T SNPs to have significant interaction effects with genotype at the WUR10000125 (WUR) SNP, which has previously been identified to have significant associations with PRRS viral load and weight gain after PRRSV infection in the PHGC trials (Boddicker et al., 2012). The WUR SNP is in very high linkage disequilibrium (LD) with the putative causative mutation for this association in the GBP5 gene (Koltes et al., 2015).

The SNP panel that was used to genotype the pigs in the PHGC trials did not include any SNPs in the CD163 gene, because the CD163 gene was not included in porcine genome builds prior to the current 11.1 build (http://www.ensembl.org/Sus_scrofa/Info/Index). The same holds for SNPs in several other candidate genes important for host response to viral infection, including CD169, RGS16, and TRAF1, although these genes were included in the earlier 10.2 build of the porcine genome.

Van Breedam et al. (2010) postulated that CD169 is a required receptor on the surface of macrophages for PRRSV attachment and internalization into macrophages, based on binding with sialic acid on the PRRSV surface in vitro. However, Prather et al. (2013) showed that CD169 gene knockout pigs developed PRRSV viremia to a similar degree as wild-type pigs after PRRSV infection, which demonstrated that CD169 is not required for PRRSV infection. However, in addition to having a role in pathogen uptake into macrophages, CD169 has other roles in the immune response. Specifically, CD169 can promote CD8+ cytotoxic T cell activity through cross-presentation with CD8α+ dendritic cells (classical DC1, cDC1; van Dinther et al., 2018; Uchil et al., 2019). The binding of CD169 to sialic acid ligands on other cells, such as cDC1 and B cells, participates in antipathogen immune response by activating T and B cells (reviewed in Neill et al., 2012). Ren et al. (2012) identified three SNPs in the CD169 gene and found two to be associated with risk of PRRSV infection in a population of 524 pigs following a natural PRRS outbreak. Wang et al. (2012) found another non-synonymous SNP, c.878A>G, in exon 3 of the CD169 gene to be associated with white blood cell count in peripheral blood in a mixed breed population of 128 healthy pigs. Here, we evaluated associations of these same four SNPs in the CD169 gene with host response to PRRSV infection in the PHGC trials.

The regulator of G protein signaling 16 (RGS16) gene produces a GTPase-activating protein that can induce T cell migration and activation (Webster et al., 2014). RGS16 can interact with ORF3 of PCV2 and plays a role in ORF3 translocation to the cell nucleus (Lovgren et al., 2009). ORF3 of PCV2 is involved in its pathogenesis and contributes to the spread of PCV2 in cell culture through apoptosis (Karuppannan, 2011). PCV2 is a non-enveloped, single-stranded, circular DNA virus (Todd et al., 1991) and is the causative agent of postweaning multisystemic wasting syndrome (Harding and Clark, 1997). Lim et al. (2017) found two SNPs in the 5' upstream region of the RGS16 gene to be associated with PCV2 viremia at 10 wk of age in 142 naturally infected pigs that were not vaccinated for PCV2. Therefore, we set out to validate the effects of these two RGS16 SNPs on PCV2 viral load in the PHGC PRRSV/porcine circovirus 2b (PCV2b) coinfection trials reported by Dunkelberger et al. (2017a). Both PCV2 and PRRSV can suppress the host immune defense system and persist asymptomatically in pigs, which can cause secondary infections in affected susceptible pigs. Therefore, we also tested the effect of the two SNPs in the RGS16 gene on PRRS viral load in the PHGC PRRSV-only infection trials reported by Boddicker et al. (2014a).

The TNF receptor-associated factor 1 (TRAF1) protein can interact with the Toll/IL-1 receptor (TIR) domain-containing adaptor protein (TRIF), which might negatively regulate the TRIFand Toll-like receptor-3 (TLR3)-mediated signaling pathway, which plays an essential role in mediating antiviral innate immune response (Su et al., 2005). Su et al. (2005) found a noncleavable TRAF1 mutant, TRAF1 (D163A), that lost its inhibitory role on TRIF signaling. Although TRIF is involved in TLR3mediated signaling and TLR3 protein can recognize doublestrand (ds) RNA as a pathogen-associated molecular patterns, Guo et al. (2018) identified dsRNA in cells of pigs during the persistent stage of PRRSV infection. In this study, we evaluated two SNPs in the TRAF1 gene.

Against this background, the objective of this study was to identify associations of natural variation in the CD163, CD169, RGS16, and TRAF1 genes on host response of nursery pigs to PRRSV-only infection and to coinfection with PRRSV and PCV2b with or without prior vaccination with a PRRS-modified live virus vaccine.

Materials and Methods

The Kansas State University Institutional Animal Care and Use Committee approved all experimental protocols for the animal trials used herein.

Experimental design

Data and DNA used for this study were from the PRRSV infection and PRRSV-PCV2b coinfection PHGC trials. A detailed description of the PHGC PRRSV-infection trials (PHGC 1–8) is in Boddicker et al. (2014a). Briefly, 8 groups of ~200 commercial crossbred piglets (PHGC trials 1–8) from one of six breeding companies were shipped to Kansas State University (KSU, Manhattan, KS) at weaning. After 1 wk of acclimation, all pigs were inoculated with a 10⁵ tissue culture infectious dose (TCID50) of the NVSL PRRSV isolate, with approximately half of the dose injected intramuscularly and the rest intranasally. Blood samples were collected from each pig at 0, 4, 7, 11, 14, 21, 28, 35, and 42 dpi. Body weight was recorded weekly, starting at 0 dpi and most pigs were euthanized at 42 dpi.

A detailed description of the two coinfection trials, PHGC 16 (n = 199) and 20 (n = 197), is in Dunkelberger et al. (2017a). Briefly, pigs were commercial Large White × Landrace crossbred barrows from one genetic source and one high-health multiplier farm. Piglets were pre-selected based on genotype at the WUR SNP, with approximately 50% AA and 50% AB. After shipping to Kansas State University, pigs were randomly assigned to one of two rooms and balanced by WUR genotype. After 3–4 d of

acclimation, pigs in one room were vaccinated with a 2 mL dose of a PRRS-modified live virus vaccine (Ingelvac PRRS, Boehringer Ingelheim Vetmedica Inc., St. Joseph, MO; GenBank accession no. AF159149). After 28 days postvaccination (**dpv**), all pigs in both rooms were coinfected on 0 dpi with a 2 mL dose of 10⁵ TCID50 PRRSV (isolate KS62; GenBank accession no. KM035803) and 10^{3.6} TCID50 PCV2b (GenBank accession no. JQ692110), which were administered both intranasally and intramuscularly (Niederwerder et al., 2015). All pigs were euthanized at 42 dpi. Blood samples were collected on vaccinated pigs at 0, 4, 7, 11, 14, and 21 dpv and on all pigs at 0, 4, 7, 11, 14, 21, 28, 35, and 42 dpi. All pigs were weighed weekly, starting at 0 dpv.

Genotypes

All pigs from the PRRSV-infection trials were genotyped using the Illumina Porcine SNP60 BeadChip (Ramos et al., 2009) and pigs from the coinfection trials were genotyped using the GeneSeek-Neogen Porcine SNP80 BeadChip (Dunkelberger et al., 2017b). Fixed SNPs and SNPs with a genotyping call rate less than 0.85 were removed, while genotypes with a gene call score lower than 0.3 were set to missing.

For the purposes of this study, DNA samples from all pigs were genotyped for an additional 27 SNPs in the four candidate genes (19 in CD163, 4 in CD169, and 2 in both TRAF1 and RGS16) using a custom-designed MassARRAY platform (Agena Bioscience, San Diego, CA, USA) according to the manufacturer's instructions. Most of these SNPs were previously identified to be associated with host response to PRRSV or PCV2 (RGS16 only) infection (Ren et al., 2012; Wang et al., 2012; Lim et al., 2017, 2018). All pigs were genotyped for two SNPs in the TRAF1 gene that were identified in our previous tonsil RNA-seq data (Dong et al., 2021). Details on the 27 SNPs are in Supplementary Table S1 annotated based on build 11.1 of the pig genome (Ensembl).

LD between SNPs in each gene was quantified based on r^2 , using Haploview 4.2 (Barrett et al., 2005), both across trials and by genetic source. SNPs within a gene that were in complete LD across all PRRS trials or across the two coinfection trials were merged.

Phenotypes

For the PRRSV-infection trials, two phenotypes were analyzed: PRRS viral load, which was calculated as the area under the curve of log₁₀ viral copies/mL of serum from 0 to 21 dpi, following Boddicker et al. (2012) and weight gain after infection, which was calculated as the difference in body weights at 42 and 0 dpi. Viral load represents an overall measure of the immune response after infection, which previous studies have shown to be more heritable than viremia at individual time points or than specific parameters of the viremia curve (Boddicker et al., 2012; Hess et al., 2016). For the coinfection trials, the host response traits described by Dunkelberger et al. (2017a) were analyzed: PRRS viral load postvaccination from 0 to 28 dpv (Vaccination viral load), PRRS viral load post coinfection, and PCV2b viral load, all calculated as area under the curve of the $\log_{\scriptscriptstyle 10}$ of PRRSV RNA or PCV2b DNA copies/mL of serum. Growth rate postvaccination and post coinfection were calculated as the regression of body weight on age from 0 to 28 dpv and from 0 to 42 dpi, respectively. The same trait recorded on vaccinated vs. non-vaccinated pigs were treated as separate genetic traits in the association analyses.

Association analyses for the PRRSV-infection trials

Associations of the 27 genotyped candidate gene SNPs with viral load and weight gain in the PRRSV-only trials were analyzed

using three methods: single SNP analyses and Bayesian variable selection analyses. Single SNP analyses were similar to those described by Waide et al. (2017), using ASReml 4 (Gilmour et al., 2015). Briefly, the following linear mixed model was used to test the association of each SNP with PRRS viral load and weight gain by fitting the genotype at one SNP at a time as a fixed effect in the following model (Model 1):

$$\begin{array}{l} Y_{ijklmnop} = \mu + \ Trial_{j} + \ Parity_{k(j)} + \ WUR_l + Sex_m + \ SNP_n \\ + \ SNP_n * \ Trial_{j} + \beta_1 * \ InWt_i + \beta_2 * \ InAge_i \\ + \ Animal_i + \ Litter_o + \ Pen_{p(j)} + \ e_{ijklmnop,} \end{array}$$

where $Y_{ijklmnop}$ is the observed phenotype (PRRS viral load or weight gain); Trial, is the fixed effect of the jth trial (1-8); Parity, is the fixed effect of parity of sow nested within trial (20 levels); WUR, is the fixed effect of WUR SNP genotype (AA, AB, or BB); Sex_m is the fixed effect of sex (male or female); SNP_n is the fixed effect of the nth genotype (0, 1, or 2) at the fitted SNP; β_{p} is the partial regression coefficients for the covariates of initial weight (InWt; P = 1) and initial age (InAge; P = 2); Animal, is the random genetic effect of the ith individual, assumed distributed ~N(0, $G\sigma_a^2$), with **G** equal to the genomic relationship matrix constructed using all genotyped SNPs (60K plus the 27 candidate gene SNPs), and σ_a^2 is the additive genetic variance; Litter, is the random litter effect (400 levels), assumed to be distributed ~N(0, I σ_1^2); and Pen is the random effect of pen nested within trial (97 levels), assumed to be distributed ~N(0, I σ_n^2). Since the effect of trial (environmental effect) was confounded with genetic source in the experimental design, we assumed that pigs from different genetic sources were not related when constructing G. The Benjamini-Hochberg method (Benjamini and Hochberg, 1995) was used to control false discovery rate (FDR) across the 27 analyzed SNPs but separately for each trait.

For the Bayesian variable selection analyses, effects of genotypes at all SNPs (60K plus the 27 candidate gene SNPs and the putative causal SNP rs340943904 in GBP5) were fitted simultaneously as random allele substitution effects using the Bayes-B method (Habier et al., 2011), as implemented in the JWAS software (Cheng et al., 2018). The linear mixed model was the same as used for the single SNP analysis (Model [1]) but without WUR genotype as a fixed effect and with the effects of SNP and animal replaced by $\sum_{n=1}^{N} z_{ni} \alpha_n \delta_n$, where z_{ni} is the vector of the genotype covariate for SNP n (n = 1 to N) for individual i based on the number of B alleles using Illumina's genotype calling (coded 0, 1, 2, or equal to the average for the individual's genetic background (i.e., genetic source) for missing genotypes); α_n is the allele substitution effect for SNP *n* and δ_n is the indicator for whether SNP *n* was included ($\delta_n = 1$) or excluded ($\delta_n = 0$) in the model for a given iteration of the Markov Chain Monte Carlo run. The prior probability of $\delta_n = 0$ was set equal to π = 0.99. A total of 50,000 iterations were run for each analysis, with the first 5,000 iterations discarded as burn-in. Genomic regions associated with traits were identified based on the genetic variance explained by each non-overlapping 1 Mb window, based on build 11.1 of the pig genome (Ensembl).

Bivariate single SNP analyses for coinfection trials

Associations of the candidate gene SNPs with traits evaluated postvaccination and post coinfection were analyzed using the bivariate animal models described by Dunkelberger et al. (2017b) to allow for differences in the genetic control of a trait, depending on prior PRRS vaccination. The linear mixed models allowed estimation of the effect of each SNP, one at a time, averaged across PRRS vaccination status, and the interaction effect between SNP genotype and vaccination status on PRRS and PCV2b viral load post coinfection and growth rate postvaccination or post coinfection. Fixed effects fitted in the model included trial and WUR genotype, covariates of initial weight, age, and PCV2b viremia at 0 dpi, and the random effects of pen within trial, litter, and animal to account for random environmental, common environmental, and genetic effects, respectively, with bivariate distributions equivalent to the univariate distributions of Model 1, but allowing for covariances between the two traits analyzed (with and without vaccination).

Associations of SNPs in candidate genes with expression of the corresponding genes

Expression of the CD163, CD169, and RSG16 genes was measured in blood at multiple time points after vaccination and coinfection in the coinfection trials, using QuantSeq 3' mRNA-Seq (Dong, 2019). Blood RNA levels from two sets of pigs from PHGC 16 (PHGC 16.1 and 16.2) and from one set of pigs from PHGC 20 were used. For PHGC 16.1, 190 blood samples collected on 28 piglets from 7 litters that had one piglet for each vaccination status by WUR genotype combination (AA-vaccinated, AB-vaccinated, AA-non-vaccinated, and AB-non-vaccinated) were selected. For PHGC 16.2, 288 blood samples on 49 piglets from 16 litters with at least two of the four vaccination status by WUR genotype combinations were selected. For PHGC 20, 216 blood samples on 30 piglets from 9 litters with at least three of the four vaccination status by WUR genotype combinations were selected. Total RNA was isolated using Preserved Blood RNA Purification Kit I (Norgen, Canada) according to the manufacturer's protocol. RNA concentration, purity and integrity were first measured with a NanoDrop ND-1000 UV-vis Spectrophotometer (NanoDrop Technologies Inc., Wilmington, DE, USA) and then using the RNA Nano 6000 Assay kit on the Bioanalyzer 2100 system (Agilent Technologies, CA, USA). As a measurement of the quality of the RNA in a sample, the RNA integrity number (RIN) of the extracted RNA was determined for each sample by the 2100 Bioanalyzer (Agilent Technologies) using the Eukaryote total RNA 6000 Nano kit. RNA-seq libraries were generated from ~500 ng of total RNA from each sample, using the QuantSeq 3' mRNA-Seq Library Prep Kit FWD for Illumina, following the manufacturer's protocol. For PHGC 16.2 and 20, the RNA Removal Solution-Globin Block kit for Sus scrofa (commercially available as RS-GBSs: Lexogen Cat. No. 071; Lim et al., 2019) was used to reduce the presence of HBA and HBB in the library. For PHGC 16.1, the regular Removal Solution without globin block was used because the globin block kit was not available yet at the time these samples were sequenced. Libraries from piglets from the same litter were assigned to the same plate and multiplexed to 96 samples. Each plate was loaded on two lanes of the Illumina HiSeq 3000 Sequencing System (Illumina, USA) and 50 bp single end reads sequenced.

The raw RNA sequencing data were processed using a pipeline with Bbduk (https://jgi.doe.gov/data-and-tools/ bbtools/bb-tools-user-guide/bbduk-guide/) to remove poly-A tails, adapter sequences, and low-quality bases, FastQC (Version 0.11.3) for checking read quality before and after trimming (Andrew et al., 2010), and STAR (Version 2.5.3; Dobin et al., 2013) for read alignment. To avoid multiple mapping issues of hemoglobin genes based on the Sus Scrofa 11.1 reference genome, one of two similar exon sequences that are present in 11.1 within HBA (ENSSSCG0000007978) and HBB-like (ENSSSCG0000014727) were masked. For gene annotation, the Ensembl pig 11.1 gene annotation was used. Any reads from the HBA (ENSSSCG0000007978) and HBB (ENSSSCG00000014725) genes were filtered out before further analyses. Samples that had a 75th percentile read counts across all genes that was less than or equal to two were removed. Genes that had average read counts across all remaining samples that were less than or equal to two were excluded from further analysis.

Gene expression counts (on log, scale of [count per million+1]) of the CD163, CD169, and RSG16 genes were extracted from the three resulting data sets and combined for single SNP association analyses with SNPs in the CD163, CD169, and RSG16 genes (the SNPs in TRAF1 gene were not included in this analysis because the two SNPs in TRAF1 were in complete LD and all but two pigs were of one homozygous genotype in PHGC 16 and 20). The analyses were conducted separately for time points before and after coinfection, using a mixed linear model in SAS 9.4 (SAS Institute, Cary, NC). The full model included the fixed effects of genotype at a SNP in the CD163, CD169, and RSG16 genes (one at a time), WUR genotype, PRRS vaccination status, dpv (or dpi), RNA integrity number, and trial (PHGC 16 or 20), and the random effect of litter. For each data set (before and after coinfection), a compound symmetry covariance structure was fitted for residuals to account for the dependence of gene expression in samples from the same pig across time points. We did not conduct multiple test correction because the number of SNPs analyzed was limited (9, 4, and 2 for the CD163, CD169, and RSG16 genes, respectively, after merging SNPs in complete LD and excluding SNPs that were fixed in the coinfection trials).

Results

Linkage disequilibrium

Pigs from eight PRRSV infection and from two PRRSV/PCV2b coinfection trials of ~200 pigs each were genotyped for 27 SNPs in four candidate genes (19 in CD163, 4 in CD169, and 2 each in both TRAF1 and RGS16; Supplementary Table S1). Pigs were from six different commercial line crosses (see Boddicker et al., 2014a; Dunkelberger et al., 2017a). Pigs from PRRSV-only trials 1, 2, and 3, and from the two coinfection trials were Landrace × Yorkshire crossbred pigs from the same breeding company. Pigs from the PRRSV-only and the coinfection trials had previously been genotyped using the 60K and 80K SNP panels, respectively, which did not include SNPs in the CD163, CD169, TRAF1, or RGS16 genes.

Results for LD between genotyped SNPs in the CD163 gene are shown in Figure 1, both across the eight PRRSV-only trials (Figure 1A) and across the two coinfection trials (Figure 1B). Results for LD for each of the six genetic sources used in the PRRSV-only trials are shown in Supplementary Figure S1. SNPs 6, 16, and 17 were fixed in the PRRSV-only trials, while SNPs 2, 6, and 17 were fixed in the coinfection trials, and are, therefore, not shown in Figure 1. In the PRRSV-only trials, SNPs 4, 9, and 14 were in complete LD, so they were combined into one SNP called "SNP 4_9_14"; similarly, SNPs 11, 12, and 13 were merged into SNP 11_12_13. In the coinfection trials, SNPs 1, 4, 9, and 14 were in complete LD and merged into SNP 1_4_9_14, while SNPs 5, 11, 12, and 13 were combined into SNP 5_11_12_13. The presence of high LD between CD163 SNPs was fairly consistent across the PRRSV-only trials and for the coinfection trials. However, because there were some differences in LD between genetic sources (Supplementary Figure S1), the interaction between genetic source and SNP genotype was tested in the association analyses of the PRRSV-only trials.

For the CD169 SNPs, the LD was 0.6 between SNPs 1 and 4, and 0.4 between SNPs 3 and 4, while SNP 2 was in very low LD with the other three SNPs across pigs in both the PRRSV-only and the coinfection trials (results not shown). The LD between SNPs 1 and 3 was 0.2 and 0.4 in the PRRSV-only and in the coinfection trial animals, respectively. The two SNPs in the TRAF1 gene were in complete LD in both the PRRSV-only and the coinfection trial pigs. The LD between the two SNPs in the RGS16 gene were 0.3 and 0.8 in the PRRSV-only and in the coinfection trial populations, respectively.

SNP associations with host response in the PRRSVonly infection trials

In the PRRSV-only trials, five CD163 SNPs and one CD169 SNP were significantly associated with PRRS viral load (FDR < 0.1; Table 1); viral load was defined as area under the curve of the log of PRRS viremia in blood from 0 to 21 dpi (Boddicker et al., 2012). None of the evaluated SNPs had significant associations with weight gain. The five significant CD163 SNPs clustered into two groups of SNPs that were in high LD with each other: 5 and 11_12_13, and 15, 18, 19, and had similar estimates of effects on PRRS viral load. The LD between these two clusters of SNPs ranged from 0.13 to 0.27 in the PRRSV-only trials (Figure 1A).

All significant SNPs in Table 1 (FDR < 0.1) had significant interaction effects with genetic background, that is, genetic source, for PRRS viral load but not for weight gain (P > 0.1). The significant interaction effects for viral load resulted from a difference in the genotype effects in trials 1–3 (the same genetic source) vs. the combined trials 4-8 (each from a different genetic source); interactions with genetic source were not significant for trials 4, 5, 6, 7, and 8. Estimates of the effect of these six SNPs on PRRS viral load for trials 1–3 vs. 4–8 are shown in Table 2 (P < 0.1). For all CD163 SNPs, heterozygotes had significantly lower PRRS viral load than homozygotes for the major alleles in trials 1-3 but this difference was not significant for trials 4-8 (Table 2). Homozygotes for the minor alleles were not significantly different from heterozygotes for trial 1-3 but had significantly higher PRRS viral load for CD163 SNPs 5 and 11_12_13 for trials 4-8. For CD169 SNP 2, the direction of the effect was opposite between trials 1-3 and 4-8, with homozygotes for the major allele having the highest PRRS viral load for trial 1-3 but significantly lower PRRS viral load than homozygotes for the minor allele for trials 4-8 (Table 2).

The interaction effect between SNP genotype and genotype at the tag marker for GBP5 (WUR) was tested for PRRS viral load and weight gain but was only suggestive for weight gain for SNP 2 in the RGS16 gene in the PRRSV-only infection trials (Figure 2A; nominal P = 0.08, which was not significant after multiple test correction), and for weight gain for CD163 SNPs 5 and 11_12_13 in trials 1-3 (Table 3). For trials 1-3, SNP effects were significant for weight gain for the AB genotype at WUR but not for the AA genotype at WUR, with heterozygotes at SNP 5 and 11_12_13 being favorable for both weight gain (only for the AB genotype at WUR) and for PRRS viral load (for both WUR genotypes; Table 3). For SNPs 15, 18, and 19, the heterozygotes had lower PRRS viral load than homozygotes for the major alleles for both WUR genotypes, consistent with the main effect results in Table 2, but heterozygotes had greater weight gain only for WUR genotype AB, although this was significant only for SNP 19 (Table 3).

The genome-wide association study results from the Bayesian variable selection analyses are shown in Figure 3. The GBP5 window on chromosome 4 includes the putative causal SNP in the GBP5 gene and the WUR SNP, which explained the largest proportion of genetic variance for both PRRS viral load (17.8%)



Figure 1. Linkage disequilibrium (r^2) plot of the genotyped SNPs in the CD163 gene across the PRRSV-only infection trials 1 through 8 (A) and across the coinfection trials 16 and 20 (B). Black squares signify $r^2 = 100\%$ and white squares signify $r^2 = 0\%$. PRRSV, PRRS virus; SNP, single nucleotide polymorphism.

and weight gain (9.8%), consistent with previous analyses of these data (Waide et al., 2017). The CD163 and TRAF1 windows were the top two windows after the GBP5 window for PRRS viral load, although they explained less than 2% of the genetic variance (1.1% and 0.9%, respectively). However, in our single SNP analyses, the candidate SNP in the TRAF1 gene was not significantly associated

with PRRS viral load (Table 1), thus the association of this window with PRRS viral load was due to SNPs that were external to the TRAF1 gene (Supplementary Table S2 and Supplementary Figure S2). For weight gain, a 1 Mb window that was 7 Mb downstream from the CD163 window was the top window after the GBP5 window, explaining 2.4% of genetic variance.

Table 1. Association of SNPs in four candidate genes with host response to PRRSV-only infection

					Least square	means (SE) for P by genotype	PRRS viral load ³		
Gene	SNP ¹	Alleles ²	No. of animals with genotype	Minor allele frequency	0	Ч	24	Nominal P-value	False discovery rate
CD163	1	C/T	1,412	0.04	105.3 (1.0)	104.6 (1.2)	112.5 (5.1)	0.22	0.51
	2	C/A	1,414	0.03	105.3 (1.0)	106.0 (1.3)	112.1 (6.1)	0.41	0.68
	e	C/T	1,413	0.08	105.2 (1.0)	105.4 (1.1)	109.1 (2.6)	0.27	0.54
	$4_{-}9_{-}14$	G_G_C/A_A_T	1,420	0.05	105.3 (1.0)	104.4 (1.2)	112.3 (5.1)	0.14	0.44
	Ŋ	T/C	1,415	0.10	$105.7 (1.0)^{a}$	$102.8 (1.1)^{b}$	$108.0(2.5)^{a}$	0.00001	0.00002
	9	G/A	1,414	0.00	105.3 (1.0)	111.2 (4.4)	100.1 (4.4)	0.18	0.50
	7	C/G	1,411	0.30	105.6 (1.0)	105.2 (1.0)	105.2 (1.2)	0.65	0.84
	∞	A/G	1,419	0.21	105.5 (1.0)	105.2 (1.0)	105.2 (1.4)	0.75	0.85
	10	C/A	1,411	0.25	105.6 (1.0)	105.0 (1.0)	105.2 (1.3)	0.43	0.68
	$11_{-}12_{-}13$	C_G_C/T_A_A	1,420	0.12	$105.7 (1.0)^{a}$	$103.3 (1.1)^{b}$	$108.2 (2.2)^{a}$	0.00001	0.0001
	15	T/C	1,406	0.32	$106.0 (1.0)^{a}$	$104.8 (1.0)^{b}$	$104.7 (1.2)^{b}$	0.01	0.04
	16	G/A	1,412	0.07	105.3 (1.0)	105.6 (1.2)	105.5 (1.6)	0.91	0.92
	17	C/A	1,416	0.00	105.4 (1.0)	112.6 (6.1)		0.23	0.51
	18	T/C	1,408	0.42	$106.3 (1.0)^{a}$	$104.8 (1.0)^{b}$	$104.9 (1.1)^{b}$	0.01	0.04
	19	A/G	1,409	0.32	$106.0 (1.0)^{a}$	$104.8 (1.0)^{b}$	$104.8 (1.2)^{ab}$	0.01	0.04
CD169	1	G/A	1,410	0.24	105.4 (1.0)	105.3 (1.0)	106.1 (1.4)	0.72	0.85
	2	G/T	1,386	0.08	$105.6 (1.0)^{a}$	$104.0 (1.1)^{b}$	$103.1 (2.4)^{ab}$	0.02	0.07
	m	C/A	1,418	0.45	105.4 (1.0)	105.3 (1.0)	105.5 (1.0)	0.92	0.92
	4	C/T	1,411	0.35	105.5 (1.0)	105.2 (1.0)	105.3 (1.1)	0.77	0.85
TRAF1	$1_{-}2$	C_C/G_T	1,413	0.10	105.5 (1.0)	104.5 (1.3)	105.8 (2.7)	0.53	0.73
RGS16	1	A/G	1,412	0.42	105.7 (1.0)	105.3 (1.0)	104.8 (1.1)	0.30	0.55
	2	C/T	1,413	0.38	105.7 (1.0)	105.2 (1.0)	105.2 (1.1)	0.51	0.73

¹SNPs are labeled based on reference **Supplemental Table S1**. SNPs with multiple numbers indicate "merged" SNPs based on LD. ²The second letter indicates the minor allele. ³PRRS viral load was calculated as the area under the curve from 0 to 21 dpi. ⁴Homozygotes for the minor allele. ^{a,b}Estimates with different letter superscripts within a SNP are significantly different at a nominal *P* < 0.1. PRRS, porcine reproductive and respiratory syndrome; PRRS virus; LD, linkage disequilibrium.

			Estimates	(SE) of SNP gent for trials1+2+3	otype effects 3	Estimates (fo	(SE) of SNP geno or trials 4+5+6+7	type effects +8	
Gene	SNP	Alleles ³	0	Ч	24	0	1	2	Nominal P-value $^{\circ}$ of genetic background by SNP interaction
CD163	5	T/C	0 ^a	–5.7 (0.9) ^b	-2.0 (3.8) ^{ab}	0.8 (0.8) ^a	0ª	5.9 (2.8) ^b	5.4 × 10 ⁻⁹
	$11_{-}12_{-}13$	C_G_C/T_A_A	0 ^a	$-5.1 (0.9)^{\circ}$	$-1.7(3.8)^{ab}$	0.5 (0.7) ^a	O ^a	$5.4(2.3)^{b}$	6.4×10^{-8}
	15	T/C	0 ^a	$-2.4(0.7)^{b}$	$-5.6(2.0)^{b}$	0.4 (0.5) ^a	0 ^a	0.2 (0.8) ^a	1.3×10^{-3}
	18	T/C	0 ^a	$-2.4(0.7)^{\circ}$	$-2.0(1.8)^{ab}$	0.7 (0.8) ^a	0.03 (0.6)ª	0 ^a	6.1×10^{-3}
	19	A/G	0 ^a	-2.5 (0.7) ^b	$-5.2(2.1)^{b}$	0.4 (0.5) ^a	Oa	0.3 (0.8) ^a	1.6×10^{-3}
CD169	2	G/T	$6.8(2.8)^{a}$	$4.1 (3.0)^{b}$	Qp	O ^a	$-1.0(0.7)^{ab}$	$4.3 (3.6)^{b}$	4.8×10^{-3}

from 0 to 21 apı.

curve the under The second letter indicates the minor allele load, calculated as the area KKS VIral

⁴Homozygotes for the minor allele

'Nominal P <0.01. ₀bEstimates with different letter superscripts within a SNP and trial set are significantly different at a nominal P < 0.1.

PRRS, porcine reproductive and respiratory syndrome; PRRSV, PRRS virus

SNP associations with host response in the coinfection trials

In the PRRSV and PCV2b coinfection trials, none of the SNPs in the CD163 gene had a significant main effect association with PRRS viral load, even at an FDR threshold of 0.4. However, SNPs 5 and 8 showed suggestive (nominal P of 0.05 and 0.04, respectively) interaction effects with WUR genotype on PRRS viral load following first exposure (primary PRRS viral load, i.e., postvaccination or post coinfection without vaccination; Figure 2B and 2C). Note that SNP 5 also showed an interaction effect with WUR genotype on PRRS viral load in the PRRSV-only trials; in both sets of trials, heterozygotes for SNP 5 had higher primary PRRS viral load than homozygotes for the major allele for animals with WUR genotype AB, while the effect of SNP 5 was not present (PRRSV-only) or in the opposite direction (coinfection trials) for pigs with the AA genotype at WUR. SNP 8 did not have a significant interaction effect with WUR genotype in the PRRSVonly trials (P = 0.87 for PRRS viral load; 0.96 for weight gain). SNP 7 in the CD163 gene was suggestively associated with PCV2b viral load post coinfection from 0 to 42 dpi (PCV2b viral load; FDR = 0.35, P = 0.04), with growth rate postvaccination (growth rate postvaccination, FDR = 0.32, P = 0.06), and with growth rate post coinfection (growth rate post coinfection, FDR = 0.38, P = 0.11; Table 4). Compared with homozygotes for the major allele, heterozygotes at this SNP tended to have higher PCV2b viral load and lower growth rate following coinfection, but higher growth rate following PRRS vaccination. SNP 7 did not have significant effects on either viral load or weight gain in the PRRSV-only trials.

For the CD169 gene, genotype at SNP 1 was suggestively associated with PCV2b viral load (FDR = 0.35, nominal P = 0.03; Table 4) and had significant interaction effects with WUR genotype on growth rate postvaccination and with growth rate post coinfection (P = 0.09 and 0.03, Figure 2D and 2E). Pigs that were homozygous for the minor allele at SNP 1 had greater PCV2b viral load and tended to have lower growth rate following coinfection (Table 4), especially for pigs with the AB genotype at WUR (Figure 2E). Genotype at SNP 3 in the CD169 gene was suggestively associated with growth rate post coinfection (FDR = 0.38, P = 0.11). Finally, SNPs 2 and 4 in the CD169 gene had significant interaction effects with PRRS vaccination status for growth rate postvaccination (P = 0.07) and for PCV2b viral load (P = 0.02), respectively (Figure 2F and 2G).

For the RGS16 gene, SNP 2 had a significant interaction effect with WUR genotype on growth rate postvaccination (P = 0.01, Figure 2H), with the difference in growth rate between pigs with the AB vs. AA genotypes at WUR increasing with the number of minor alleles carried at SNP 2, starting with essentially no effect for pigs that were homozygous for the major allele at SNP 2. The genotyped SNPs in the TRAF1 gene were not significantly associated with any of the traits evaluated from the coinfection trials.

SNP associations with expression of the CD163, CD169, and RSG16 genes

A generalized mixed linear model was used for analysis of associations of the candidate gene SNPs with the level of whole blood RNA expression of their respective candidate genes (CD163, CD169, and RSG16) across time points in the coinfection trials, separately for time points pre- and post coinfection. The final model was the same for the pre- and the post coinfection data sets and did not include any two-way interactions of the candidate SNP genotype, WUR genotype, vaccination status,



Figure 2. Interaction effects (and SE bars) between genotype of SNPs in candidate genes and WUR genotype or PRRSV vaccination status. Effects of SNP2 in the RGS16 gene with a significant interaction effect with WUR genotype on weight gain from 0 to 42 days post infection in the PRRSV-only infection trials (A). Effects of SNP 5 (B) and 8 (C) in the CD163 gene that had significant interaction effects with WUR genotype on vaccination viral load of vaccinated pigs and PRRS viral load post coinfection of non-vaccinated pigs. Effects of SNP 1 in the CD169 gene with significant (nominal P = 0.09 and 0.03) interaction effects with WUR genotype on growth rate post PRRS vaccination (D) and growth rate post coinfection (E) in the coinfection trials. Effects of SNP 2 and 4 in the CD169 gene with significant interaction effects with WUR genotype on growth rate post vaccination status on growth rate postvaccination (F) and PCV2b viral load (G). Effects of SNP 2 in the RGS16 gene with significant interaction effects with WUR genotype on growth rate postvaccination (H). Growth rate was calculated as the regression of body weight on dpi using body weight data from -28 to 0 and 0 to 42 days post coinfection, and PCV2b viral load were calculated for each individual as the area under the curve of log-transformed viremia from -28 to 0, 0 to 21, and 0 to 42 days post coinfection, respectively. PRRS, porcine reproductive and respiratory syndrome; PRRSV, PRRS virus; SNP, single nucleotide polymorphism; PCV2b, porcine circovirus 2b.

and dpv or dpi because none were significant (P > 0.1). Before coinfection, genotypes at SNPs 7, 8, 15, 16, and 18 in the CD163 gene were significantly associated with CD163 expression (P < 0.1; Table 5). After coinfection, genotypes at SNPs 5 (in complete LD with SNPs 11, 12, and 13), 15, 16, 18, and 19 in the CD163 gene were significantly associated with CD163 expression (P < 0.1; Table 5). For all these SNPs, heterozygotes had a greater level of expression than homozygotes for the major gene.

For the CD169 gene, genotypes at SNPs 1 and 4 were significantly associated with CD169 expression before coinfection, while genotypes at SNPs 1, 3, and 4 were significantly associated with CD169 expression after coinfection (P < 0.1; Table 5). For SNPs 1 and 4, homozygotes for the major alleles had the highest expression of CD169, both before and after coinfection. For SNP 3, homozygotes for the major allele had the

lowest level of expression after coinfection. Finally, for the RGS16 gene, genotypes at SNPs 1 and 2 were significantly associated with RGS16 expression before coinfection, while genotypes at SNP 1 were also significantly associated with RGS16 expression after coinfection but in the opposite direction (P < 0.1; Table 5). Homozygotes for the major allele at this SNP had the highest level of expression.

Discussion

This study evaluated and validated the association of SNPs in four candidate genes (CD163, CD169, RGS16, and TRAF1) with host response to PRRSV infection in both PRRSV-only and PRRSV/PCV2b coinfection trials. The candidate genes and SNPs were selected based on the known involvement of these genes

		the	AA WUR genoty	re effection for	effec	ts for the AB W	JR genotype	
Phenotype SNP All	Alleles ¹	02	1	2	0	1	2	Nominal P-value of WUR by SNP interaction
Weight gain ³ 5 T/C		-1.7 (0.5) ^a	-1.7 (0.7) ^a	–3.8 (2.3) ^a	Oa	2.8 (1.1) ^b	I	0.013
11_12_13 C_G_0	3_C/T_A_A	-1.7 (0.5) ^a	-2.2 (0.7) ^a	–3.9 (2.3) ^a	Oa	$2.5(1.0)^{b}$	I	6000
15 T/C		$-1.5(0.6)^{a}$	$-1.3 (0.6)^{a}$	-2.8 (1.5) ^a	Oa	$1.1(0.7)^{a}$	$1.7 (1.9)^{a}$	0.279
18 T/C		$-1.6(0.6)^{a}$	$-1.4 (0.6)^{a}$	$-3.9(1.4)^{b}$	O ^a	1.0 (0.7) ^a	$1.5(1.7)^{a}$	0.156
19 A/G	(1)	$-1.5(0.6)^{a}$	$-1.3 (0.6)^{a}$	$-3.6(1.6)^{a}$	Oa	$1.2 (0.7)^{b}$	$1.8(1.9)^{ab}$	0.162
PRRS viral load ⁴ 5 T/C		4.9 (0.8) ^a	-0.8 (1.3) ^b	$4.0(4.2)^{ab}$	Oa	$-6.8(1.9)^{b}$		0.582
11_12_13 C_G_0	5_C/T_A_A	$4.8(0.8)^{a}$	-0.3 (1.3) ^b	$4.2 (4.2)^{ab}$	O ^a	$-6.3(1.8)^{\rm b}$	I	0.557
15 T/C		$4.9(1.0)^{a}$	$2.5(1.1)^{b}$	$-1.2(2.8)^{b}$	Oa	$-2.5(1.3)^{b}$	–3.6 (3.5) ^{ab}	0.844
18 T/C		$4.8(1.0)^{a}$	$2.4 (1.1)^{b}$	3.5 (2.5) ^{ab}	Оа	$-2.6(1.4)^{b}$	–2.8 (3.2) ^{ab}	0.919
19 A/G	(1)	$4.7 (1.0)^{a}$	$2.3 (1.1)^{b}$	–0.9 (3.0) ^{ab}	Oa	$-2.8(1.3)^{b}$	$-3.7(3.5)^{b}$	0.875

₀bEstimates with different letter superscripts within a row and WUR genotype are significantly different at a nominal P < 0.1. -Indicates few or zero individuals with this genotype.

PRRS viral load, calculated as the area under the curve from 0 to 21 dpi.

in host responses to PRRSV and/or PCV2 infection and previous association results. The large sample sizes of the studies used here substantially add to the knowledge of the potential roles of these genes and on SNPs in these genes that can be used to select for improved host response to PRRSV and/or PCV2 infection. Detailed results are discussed in the following sections.

Effects at CD163

Since the CD163 gene was not in the pig genome build before the 11.1 version, the SNP genotyping that was used in the PHGC trials did not include SNPs in the CD163 gene. Therefore, we custom genotyped pigs from the PHGC trials for selected SNPs in the CD163 gene in order to identify associations with PRRS/PCV2b viral load and weight gain under PRRSV-only and coinfection challenges. Several significant associations were identified. As noted in the following, results suggest the influence of one quantitative trait loci (QTL) around SNPs 5, 11_12_13, 15, 18, and 19 in the CD163 gene, with heterozygotes having more favorable host responses. Effects, however, depended on genetic background, that is, genetic source, likely because of differences in LD, and on genotype at the WUR SNP for the GBP5 gene. There was evidence of another QTL around SNP 7 in the CD163 gene, for which homozygotes for the major allele had a more favorable host response in the coinfection trials.

Effects at CD163 depend on genetic background

In the PRRSV-only trials, five SNPs in the CD163 gene were significantly associated with PRRS viral load (Table 1). These SNPs clustered into two groups that were in high LD with each other (Figure 1): SNPs 5 and 11_12_13, and SNPs 15, 18, and 19. These groups either represent two QTL or each group of SNPs picks up part of the same QTL. To investigate this further, we fitted one SNP from each of these two groups simultaneously in the model, along with their interaction, both for all trials and for trials 1-3 only. In this model (results not shown), the effects of SNPs 5 and 11_12_13 were still significant but the effects of SNPs 15, 18, and 19 and their interaction with a SNP from the other group were not significant. This suggests that there may only be one QTL in this region.

For PRRS viral load in the PRRSV-only trials, all significant CD163 SNPs had significant interaction effects with genetic background (Table 2). Interestingly, homozygotes for the major alleles at SNPs 5 and 11_12_13 were favorable in trials 4-8 but unfavorable in trials 1-3, suggesting that the phase between these SNPs and the QTL is opposite in these two sets of trials. The effects of SNPs 15, 18, and 19 were only significant for trials 1-3 (Table 2). Within the PRRSV-only trials 1-3 and the coinfection trials from the same genetic source, SNPs 15, 18, and 19 in the CD163 gene were in high LD with each other (Supplementary Figure S1A and S1B). In the coinfection trials, although not significant (P = 0.39 and 0.25), the effect of SNPs 5_11_12_13 (in complete LD with each other) on primary PRRS viral load and PRRS viral load post coinfection was also numerically smaller for heterozygotes (76.6 \pm 2.5 and 68.6 \pm 1.8) than for homozygotes for the major alleles (78.1 \pm 1.2 and 71.1 \pm 0.8) (Table 6). Our results for SNP 18 in PRRSV-only trials 1–3 confirm results of Lim et al. (2018), with the same direction of effects on PRRS viral load.

Pigs that were heterozygous at SNPs 5_11_12_13, 15, 18, and 19 had a significantly higher level of CD163 expression after coinfection (Table 5); however, there was no strong significant effect of these SNPs on CD163 expression before coinfection. Given the role of the CD163 receptor for entry of PRRSV into macrophages (Whitworth et al., 2016), higher expression of



Figure 3. Genome-wide association results for PRRS viral load (A) and weight gain (B) in the PRRSV-only trials using Bayes-B analyses. Results show the percent of genetic variance explained by 1 Mb non-overlapping windows of SNPs across chromosomes. PRRS viral load was calculated as area under the curve of log-transformed viremia from 0 to 21 days post infection. Weight gain was calculated as the difference between body weight at 42 and 0 days post infection. Windows that include genotyped SNPs in the four genes are in green, tagged by the gene name. PRRS, porcine reproductive and respiratory syndrome; PRRSV, PRRS virus; SNP, single nucleotide polymorphism.

CD163 might be expected to be associated with higher PRRS viral load, but the opposite was observed here. This difference might be due to expression of other genes that are needed to complete viral replication in macrophages. We considered confirming the association of SNPs in the CD163 gene with CD163 gene expression in a PRRSV-only infection trial (trial 3) that we had RNA-seq data on, as described in Schroyen et al. (2016). However, the minor allele frequency at these SNPs was too small in the 16 pigs evaluated in that study.

Taking all these results together, selecting for the heterozygotes at SNPs 5, 11_12_13, 15, 18, and 19 in the CD163 gene may improve disease resistance (Table 6). However, this needs further research because we only detected the associations of these SNPs with host response in one genetic source in the PRRSV-only infection trials, while heterozygotes unexpectedly showed higher expression of the CD163 gene than homozygotes for the major alleles at these SNPs after coinfection.

Genotype at SNP 7 in the CD163 gene was associated with PCV2b serum viremia in the coinfection trials, as well as with growth rate before and after coinfection (Table 4), and with expression of the CD163 gene before coinfection (Table 5). Compared with heterozygotes, homozygotes for the major allele (CC) at SNP 7 were favorable in the coinfection trials, with lower

CD163 gene expression before coinfection and lower PCV2b viral load and higher growth rate after coinfection (except for lower growth rate postvaccination, Table 4), although there was no effect on PRRS viral load. Lim et al. (2018) found that pigs with the CC genotype had higher PRRS viremia than CG and GG pigs and a similar trend was observed in our PRRSV-only infection trials (Table 1). In the coinfection trials, SNP 7 had low LD with SNPs 5_11_12_13, 15, 18 (but moderate in the PRRSV-only infection trials), and 19 (Figure 1). Thus, the associations found for SNP 7 may represent another QTL, with effects on PCV2b viral load under coinfection with PRRSV, but more data is needed before strong conclusions can be drawn.

Effects at CD163 depend on genotype at GBP5

In the PRRSV-only infection trial genome-wide association study, the GBP5 window (Figure 3), which includes the putative causative major quantitative trait nucleotide for host response to PRRSV infection in the GBP5 gene (Koltes et al., 2015), explained the largest proportion of genetic variance for both PRRS viral load and weight gain (Figure 3), consistent with our previous results for the same data (Boddicker et al., 2012, 2014a, 2014b; Waide et al. 2017). In the coinfection trials, pigs with the AB genotype at the WUR SNP, which is in high

			-[]	- [- [[; X K		Least square	e means (SE) by S	NP genotype			
Gene	SNP	Allele ¹	with genotype	minor allele frequency	Trait	0	1	22	raise discovery rate ³	P-value	nominal <i>P</i> -value interaction with WUR
CD163	ъ	T/C	362	0.07	Primary PRRS viral	78.1 (1.2)	76.6 (2.5)	I	1.00	0.39	0.05
CD163	00	A/G	352	0.04	load ⁴	78.4 (1.2)	78.3 (3.5)	I	1.00	0.95	0.04
CD163	7	C/G	349	0.05	PCV2b viral load ⁵	$129.4 (4.1)^{a}$	$146.9(9.1)^{b}$	I	0.35	0.04	I
CD169	1	G/A	322	0.27		133.0 (5.0) ^a	124.9 (5.0) ^a	186.2 (28.6) ^b	0.35	0.03	I
CD163	7	C/G	349	0.05	Growth rate	$0.44 (0.01)^{a}$	0.47 (0.02) ^b	I	0.32	0.06	I
CD169	1	G/A	322	0.27	postvaccination ⁶	0.43 (0.01)	0.45 (0.01)	0.46 (0.05)	0.64	0.21	0.09
RGS16	2	C/T	334	0.25		0.44 (0.01)	0.44 (0.01)	0.42 (0.02)	0.64	0.56	0.01
CD163	7	C/G	349	0.05	Growth rate post	0.85 (0.01)	0.78 (0.04)	I	0.38	0.11	
CD169	1	G/A	322	0.27	coinfection ⁷	0.83 (0.02)	0.84 (0.02)	0.72 (0.11)	0.84	0.62	0.03
CD169	ŝ	A/C	346	0.4		0.81 (0.02) ^{ab}	0.85 (0.01) ^a	0.88 (0.03) ^b	0.38	0.11	I
¹ The sect ² Homozy ³ False dis	and lettel gote of tl covery ra	r indicates he minor al ate <0.4.	the minor allele. Ilele.	trat evolution	th to the second s			5 			

"Primary PKKS viral load: PKKS viral load following inst exposure, inst is, postvaccination or post connection without vaccination. "PCV2b viral load: calculated as the area under the curve from 0 to 42 dpi. "Growth rate postvaccination calculated as the regression of body weight on dpi between PRRS vaccination and PRRSV/PCV2b coinfection." "Afrowth rate postvaccination calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection." "Afrowth rate postvaccination calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection. "Afrowth rate postvaccination calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection." "Afrowth rate postvaccination calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection. "Afrowth rate postvaction calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection." "Afrowth rate postvaction calculated as the regression of body weight on dpi post PRRSV/PCV2b coinfection." "Afrowth rate postvaction calculated as the regression of body weight on dpi post PRRSV." "Afrowth rate postvaction calculated as the regression of body weight on dpi post PRRSV." "Afrowth rate postvactive and respiratory syndrome; PRRSV, PRRS, porcine circovirus 2b."

Table 5. Estimates (SE) of the effects of genotype at SNPs in the CD163, CD169, and RSG16 genes that are associated with the expression of their respective genes before and after coinfection with PRRSV and PCV2

				No opinalo	Minerellele	Least squa	are means (SE)	by genotype	Naminal
	Gene	SNP	Allele1	with genotype	frequency	0	1	2 ²	P-value ³
Before	CD163	5	T/C	362	0.07	3.7 (0.2)ª	3.7 (0.2)ª	5.5 (1.0) ^b	0.19
coinfection		7	C/G	349	0.05	3.6 (0.3)ª	4.9 (0.4) ^b	_	0.0001
		8	A/G	352	0.04	3.6 (0.1)ª	5.6 (0.6) ^b	-	0.0007
		15	T/C	345	0.12	3.7 (0.2)ª	3.8 (0.2)ª	5.5 (1.0) ^b	0.04
		16	G/A	352	0.01	3.7 (0.1)ª	5.3 (0.5) ^b	_	0.0004
		18	T/C	351	0.13	3.6 (0.2)ª	3.9 (0.2)ª	5.5 (1.0) ^b	0.05
		19	A/G	337	0.12	3.7 (0.2)ª	3.7 (0.2)ª	5.6 (1.0) ^b	0.16
	CD169	1	G/A	322	0.27	2.7 (0.1)ª	2.3 (0.2) ^b	_	0.01
		2	G/T	357	0.03	2.5 (0.2)	2.8 (0.4)	2.2 (0.7)	0.62
		3	A/C	346	0.40	2.4 (0.2)ª	2.4 (0.2) ^a	2.9 (0.2) ^b	0.14
		4	C/T	343	0.40	2.8 (0.2)ª	2.3 (0.2) ^b	2.2 (0.4) ^{ab}	0.02
	RGS16	1	A/G	320	0.50	0.8 (0.2) ^{ab}	0.7 (0.2) ^b	1.1 (0.2) ^a	0.099
		2	C/T	334	0.25	0.9 (0.1) ^{ab}	0.6 (0.2) ^a	1.1 (0.2) ^b	0.07
After	CD163	5	T/C	362	0.07	3.7 (0.049)ª	4.1 (0.1) ^b	3.7 (0.4) ^{ab}	0.0012
coinfection		7	C/G	349	0.05	3.8 (0.046)	3.9 (0.1)	-	0.55
		8	A/G	352	0.04	3.8 (0.04)	4.0 (0.2)	-	0.55
		15	T/C	345	0.12	3.7 (0.1)ª	4.0 (0.1) ^b	3.7 (0.4) ^{ab}	0.003
		16	G/A	352	0.01	3.8 (0.04)ª	4.5 (0.3) ^b	-	0.04
		18	T/C	351	0.13	3.7 (0.1)ª	4.0 (0.1) ^b	3.7 (0.4) ^{ab}	0.004
		19	A/G	337	0.12	3.7 (0.1)ª	4.1 (0.1) ^b	3.7 (0.4) ^{ab}	0.001
	CD169	1	G/A	322	0.27	3.1 (0.1)ª	2.8 (0.1) ^b	-	0.008
		2	G/T	357	0.03	3.0 (0.1)ª	2.8 (0.2) ^{bc}	2.4 (0.4)°	0.33
		3	A/C	346	0.40	2.8 (0.1)ª	3.0 (0.1) ^b	3.3 (0.1) ^c	0.01
		4	C/T	343	0.40	3.1 (0.1)ª	2.9 (0.1) ^b	2.6 (0.2) ^b	0.02
	RGS16	1	A/G	320	0.50	1.1 (0.1)ª	0.9 (0.1) ^b	1.0 (0.1) ^{ab}	0.096
		2	C/T	334	0.25	1.0 (0.1)	0.9 (0.1)	1.0 (0.1)	0.46

¹The second letter indicates the minor allele.

²Homozygote of the minor allele.

³Nominal P < 0.1

^{a,b,c}Estimates with different letter superscripts within a SNP are significantly different at a nominal P < 0.05.

-Indicates few or zero individuals with this genotype; PRRSV, PRRS virus.

but not complete LD with the GBP5 mutation (Jeon et al., 2021), had lower primary PRRS viral load than pigs with the AA genotype at WUR, which is consistent with the findings of Dunkelberger et al. (2017a) for the same data. Pigs with at least one B allele at the WUR SNP are expected to produce a functional GBP5 protein to induce innate immunity for antiviral response (Koltes et al., 2015). Lim et al. (2018) found significant interactions of genotype at WUR with genotype at SNPs 7 and 18 in CD163 on PRRS viremia and weight gain. This suggests a potential biological interaction between GBP5 and CD163, which was further explored here. For trials 1-3, CD163 SNPs 5 and 11_12_13 had significant interactions with WUR genotype on weight gain but not on viral load. For weight gain, the effects of these SNPs was significant only for pigs with the AB WUR genotype, with heterozygotes at SNPs 5 and 11_12_13 being favorable (Table 3). For viral load, heterozygotes at these SNPs were favorable (lower viral load) for both WUR genotypes and their interaction was not significant. In the coinfection trials, SNP 5 (in complete LD with SNP 11_12_13) also showed significant interaction effects with WUR genotype for primary PRRS viral load (Figure 2B). However, in these trials, heterozygotes had lower viral load for pigs with the AA WUR genotype but higher viral load for pigs with the AB WUR genotype. For CD163 gene expression, the interaction between genotype at WUR and genotype at SNP 5_11_12_13 was not significant (results not shown).

Although CD163 SNP 8 had no significant main effect in either the PRRSV-only or coinfection trials, in the coinfection trials, we identified a significant interaction of genotype at SNP 8 with genotype at WUR on primary PRRS viral load (Figure 2C). For SNP 8, AA pigs had higher primary PRRS viral load than heterozygotes for AB pigs at WUR but lower primary PRRS viral load than heterozygotes for AA pigs at WUR. The result for AA pigs at WUR is consistent with the finding of Ren et al. (2012) that the AA genotype at SNP 8 is associated with a lower relative risk of PRRS incidence. A possible reason why SNP 8 was detected as a main effect by Ren et al. (2012) but only through an interaction with WUR genotype in our studies, may be that most of the pigs in the study of Ren et al. (2012) may have been AA for WUR, while in our coinfection trials, the number of AA and AB pigs at WUR were balanced by design. Our previous studies have noted the low frequency of the B allele at WUR in all commercial pigs investigated (Boddicker et al., 2012). Pigs with the AA genotype at SNP 8 also had lower expression of CD163 in blood before coinfection than AG pigs (Table 5). In addition, interactions of genotype at SNPs 7 and 8 with genotype at WUR on CD163 gene expression were suggestive after and before coinfection, respectively (P = 0.11 and 0.13, results not shown). SNP 8 in the CD163 gene is a non-synonymous c.2592A>G substitution in exon 11, causing a Lys851Arg change. We also identified significant interactions between WUR and CD163 SNP 15 and 16 on CD163 gene expression after coinfection (P = 0.05 and 0.06,

SNPAlleles'01 2^3 Nominal P-value01 2^3 Nominal P-value5T/C0° $-5.9(1.0)^{b}$ $-1.0(4.1)^{ab}$ $1.78^{*}10^{-3}$ $71.1(0.8)$ $68.6(1.8)$ $ 0.248$ 11_12_13C_G_C/T_AA0° $-5.4(1.0)^{b}$ $-0.8(4.1)^{ab}$ $2.57^{*}10^{-7}$ $71.1(0.8)$ $68.6(1.8)$ $ 0.248$ 15T/C0° $-2.4(0.7)^{b}$ $-0.8(4.1)^{ab}$ $2.57^{*}10^{-7}$ $71.3(0.9)$ $68.4(1.4)$ $73.7(7.4)$ 0.218 18T/C0° $-2.4(0.7)^{b}$ $-1.8(2.0)^{ab}$ 0.0011 $71.3(0.9)$ $68.4(1.4)$ $75.7(7.4)$ 0.218 19A/G0° $-2.5(0.7)^{b}$ $-4.8(2.3)^{b}$ 0.0011 $71.6(0.9)$ $68.8(1.4)$ $73.7(7.4)$ 0.183			Least by SI	square means (SE) fo NP genotype in the Pl	ır PRRS viral load² RRSV-only trials		Least squar coinfection² by	e means (SE) for PRRS <i>y</i> SNP genotype in the	viral load post coinfection trials	
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	SNP	Alleles ¹	0	Ļ	23	Nominal P-value	0	1	23	Nominal P-value
11_12_13 C_1G_2C/T_AA 0^a $-5.4(1.0)^b$ $-0.8(4.1)^{ab}$ 2.57^*10^{-7} 15 T/C 0^a $-2.4(0.7)^b$ $-5.6(2.0)^b$ 0.011 $71.3(0.9)$ $68.4(1.4)$ $73.7(7.4)$ 0.218 18 T/C 0^a $-2.4(0.7)^b$ $-1.8(2.0)^{ab}$ 0.004 $71.4(0.9)$ $68.5(1.4)$ $75.7(7.4)$ 0.218 18 T/C 0^a $-2.4(0.7)^b$ $-4.8(2.0)^{ab}$ 0.004 $71.4(0.9)$ $68.5(1.4)$ $76.9(6.9)$ 0.183 19 A/G 0^a $-2.5(0.7)^b$ $-4.8(2.3)^b$ 0.001 $71.6(0.9)$ $68.8(1.4)$ $73.8(7.4)$ 0.214	5	T/C	Oa	–5.9 (1.0) ^b	-1.0 (4.1) ^{ab}	1.78*10-8	71.1 (0.8)	68.6 (1.8)	1	0.248
15 T/C 0 ^a -2.4 (0.7) ^b -5.6 (2.0) ^b 0.011 71.3 (0.9) 68.4 (1.4) 73.7 (7.4) 0.218 18 T/C 0 ^a -2.4 (0.7) ^b -1.8 (2.0) ^{ab} 0.004 71.4 (0.9) 68.5 (1.4) 75.7 (7.4) 0.218 19 A/G 0 ^a -2.5 (0.7) ^b -4.8 (2.3) ^b 0.001 71.6 (0.9) 68.8 (1.4) 73.8 (7.4) 0.218	$11_{-}12_{-}13$	C_G_C/T_A_A	0 ^a	$-5.4(1.0)^{b}$	$-0.8(4.1)^{ab}$	$2.57^{*}10^{-7}$				
18 T/C 0 ^a -2.4 (0.7) ^b -1.8 (2.0) ^{ab} 0.004 71.4 (0.9) 68.5 (1.4) 76.9 (6.9) 0.183 19 A/G 0 ^a -2.5 (0.7) ^b -4.8 (2.3) ^b 0.001 71.6 (0.9) 68.8 (1.4) 73.8 (7.4) 0.214	15	T/C	0 ^a	$-2.4(0.7)^{b}$	$-5.6(2.0)^{b}$	0.011	71.3 (0.9)	68.4 (1.4)	73.7 (7.4)	0.218
19 A/G 0. ^a -2.5 (0.7) ^b -4.8 (2.3) ^b 0.001 71.6 (0.9) 68.8 (1.4) 73.8 (7.4) 0.214	18	T/C	0 ^a	-2.4 (0.7) ^b	$-1.8(2.0)^{ab}$	0.004	71.4 (0.9)	68.5 (1.4)	76.9 (6.9)	0.183
	19	A/G	Oa	-2.5 (0.7) ^b	-4.8 (2.3) ^b	0.001	71.6 (0.9)	68.8 (1.4)	73.8 (7.4)	0.214

results not shown), and between WUR and CD163 SNP 1 before coinfection (P = 0.08, results not shown).

In conclusion, although results were not entirely consistent, there is evidence of interaction effects of genotype at SNPs in the CD163 gene with genotype at GBP5 on host response to PRRSV infection. The observed interactions may be explained by the biological roles of GBP5 and CD163 in macrophages. Macrophages have been broadly classified into classically activated macrophages (M1) and alternatively activated macrophages (M2). In humans, monocyte-derived macrophages can be differentiated into M1, M2a, M2b, and M2c subtypes following stimulation by different cytokines (Fujiwara et al., 2016). M1 can be induced by interferon- γ (IFN- γ) and express proinflammatory molecules, including interleukin-12 (IL-12), CXCL9, CXCL10, CXCL11, nitric oxide, and reactive oxygen species. In humans, GBP5 is a candidate marker that is specifically expressed in human INF-γ-induced M1 macrophages (Fujiwara et al., 2016). However, M2a, M2b, and M2c macrophages can be induced by IL-4, IL-1 β , and IL-10, respectively, and M2 cells produce antiinflammatory molecules, including ornithine, IL-10, CCL17, CCL18, CCL22, and scavenger receptors (Goerdt and Orfanos, 1999; Gordon, 2003; Mosser, 2003; Mantovani et al., 2004; Martinez et al., 2006). CD163 is a marker for M2c macrophages (Fujiwara et al., 2016). If immature macrophages become M1, they will produce GBP5 and, thus, have relatively low CD163 production. Therefore, an immature macrophage in humans can have one of two fates: 1) become M1 expressing GBP5 or 2) become M2c expressing CD163.

In pigs, CD163 surface expression is downregulated by IL-4 and upregulated by IL-10 (Pérez et al., 2008). Moreover, all-trans retinoic acid induces partial alternative activation of porcine M2a through IL-4, and further suppresses CD163 expression (Chen et al., 2019). The level of expression of CD163 and GBP5 may depend on the fate of the immature macrophages. When GBP5 is functional, it may have a positive effect on suppressing the receptor function of CD163, especially the interaction effect on PRRS viral load, with genotype at SNPs 5 and 8 in the CD163 gene and genotype at GBP5 resulting in antagonistic interactions (Figure 2B and 2C). An interaction between these two genes may also be reflected in the levels of expression of these two genes; using the coinfection trial data, the correlation between count per million levels of expression of the CD163 and GBP5 genes was on average negative, although not significant, at time points before coinfection (-0.42 ± 0.52 , P = 0.48). However, at time points after coinfection, the correlation was on average positive and significant (0.74 \pm 0.34, P = 0.09). The nonsignificant correlation before coinfection might be because mature macrophages are in tissues but not in blood.

Effects at CD169

PRRS, porcine reproductive and respiratory syndrome; PRRSV, PRRS virus

-Indicates few or zero individuals with this genotype.

Although CD169 is not a required receptor for PRRSV infection, unlike CD163, CD169 plays roles in anti-pathogen immune response (reviewed in Neill et al., 2012). Both Wang et al. (2012) and Ren et al. (2012) identified associations of SNPs in the CD169 gene to be associated with response to PRRSV infection. Several associations were also identified in our study but there was also evidence of interaction effects with genetic background and genotype at WUR.

Main effects at CD169

In the PRRSV/PCV2b coinfection trials, CD169 SNP 1 was significantly associated with PCV2b viral load, with pigs with the AA genotype showing higher PCV2b viral load than the other two

genotypes (Table 4). Additionally, AG pigs showed significantly lower expression of CD169 before and after coinfection than GG pigs (Table 5). Because CD169 can enhance CD8 associated immune responses (Neill et al., 2012; van Dinther et al., 2018; Uchil et al., 2019), greater expression of CD169 gene in GG pigs may alter antiviral immunity. In the PRRSV-only infection trials, pigs with the AA genotype at SNP 1 had higher PRRS viral load than pigs with the other two genotypes at this SNP, while GG pigs tended to have higher weight gain than pigs with the other two genotypes, although these effects were not significant (P = 0.21 and 0.24, results not shown). These trends are, however, agree with findings by Wang et al. (2012) that the G allele at SNP 1 is favorable for PRRSV resistance. Based on these results, selection for the G allele at SNP 1 in the CD169 gene might improve host response to both PRRSV-only infection and PRRSV/ PCV2b coinfection.

The non-synonymous SNP 3 (C1654A in exon 6) in the CD169 gene results in a Leu552Ile substitution in the CD169 protein. In the coinfection trials, SNP 3 in the CD169 gene had a suggestive association with growth rate post coinfection (P = 0.11), with the CC genotype showing higher growth rate post coinfection than the AC genotype (Table 4). Additionally, the AA genotype was associated with significantly lower CD169 gene expression than the other two genotypes after coinfection (Table 5). However, Ren et al. (2012) showed that pigs with the AA genotype at this SNP had a lower relative risk of PRRSV infection than pigs with the other two genotypes. However, the association of SNP 3 with PRRS viral load was not significant in either the PRRSV-only or coinfection trials. The inconsistency with findings by Ren et al. (2012) might be due to the difference in how host response was determined; Ren et al. (2012) used clinical status, while we used viral load and growth rate. Thus, further research is needed to determine the putative associations of SNP 3 with host response to PRRSV infection.

The non-synonymous SNP 4 in the CD169 gene is C4175T, causing a change of Ala1392Val. In the coinfection trials, this SNP had a significant interaction effect with vaccination status on PCV2b viral load, which was caused by the negative effect of PRRS vaccination on PCV2b viral load being reversed for pigs with the TT genotype at this SNP (Figure 2G). However, for both vaccinated and non-vaccinated pigs, the CT genotype was suggestively favorable (Figure 2G) in terms of PCV2b viral load. Furthermore, in the coinfection trials, CC pigs at this SNP tended to have higher PRRS viral load post coinfection (P = 0.4), and CC pigs also tended to have higher PRRS viral load (P = 0.4) and higher weight gain (P = 0.6) in the PRRSV-only trials (results not shown). Pigs with the CT genotype at this SNP had significantly lower CD169 gene expression than CC pigs before and after coinfection (Table 5). Ren et al. (2012) found that CT pigs at this SNP had a lower relative risk of PRRSV infection than the other two genotypes. Therefore, while there is evidence that genotype at this SNP affects PRRS viral load following infection in both the PRRSV-only and coinfection (post coinfection but not primary PRRS viral load) trials, and on PCV2b viral load after coinfection, more validation is needed.

Effects at CD169 depend on genetic background

In the PRRSV-only trials, only SNP 2 was significantly associated with PRRS viral load (Table 1). The non-synonymous SNP 2 (G1640T in exon 6) results in an Arg547Leu substitution in the CD169 protein. Interestingly, SNP 2 also showed a significant interaction with genetic background, with opposite directions of associations between the two homozygotes (Table 2); the association for trials 1–3 was consistent with the finding of Ren et al. (2012) that the GT genotype for SNP 2 is favorable compared with homozygotes for the major allele (GG). In the coinfection trials, genotype at SNP 2 had a significant interaction with vaccination status on growth rate postvaccination, showing that the GT and GG genotypes had similar growth rate postvaccination among vaccinated pigs (Figure 2F). To summarize, genotype TT at SNP 2 in the CD169 gene was associated with favorable host response in PRRSV-only trials 1–3 but not in trials 4–8. Thus, the associations for this SNP need further research, including under coinfection.

Effects at CD169 depend on genotype at GBP5

SNP 1 in the CD169 gene is a non-synonymous c.878A>G SNP in exon 4, causing a change of Arg293His. In the coinfection trials, the significant interactions between genotype at this SNP with WUR genotype on growth rate postvaccination and post coinfection (Figure 2D and 2E) indicate that CD169 may interact with GBP5. However, we did not identify a significant average correlation across time points between the level of expression of the CD169 and GBP5 genes before (0.03 ± 0.58 , P = 0.97) or after (-0.45 ± 0.45 , P = 0.38) coinfection. We also did not identify significant interactions between WUR genotype at any of CD169 SNPs on CD169 gene expression, either before or after coinfection.

Effects at RGS16

The two SNPs in the RSG16 gene are located in the 5' upstream region of the RGS16 gene (Supplementary Table S1). To investigate this further, the TFBIND software (Tsunoda and Takagi, 1999) was used to search for transcription factor (TF) binding sites by inputting the sequence ± 30 bp around the SNP. Supplementary Table S5 shows the predicted TFs that may bind to the sites that include one of the two alleles of the SNPs in the 5' upstream region of the RGS16 gene. Thus, a mutation at these sites may prevent or enable the TF to bind to the promoter or enhancer region of the RGS16 gene, resulting in changes in the level of RGS16 transcription. Interestingly, a P300 binding motif was found only in the sequence that included the T allele at SNP 2 in the RGS16 gene (Supplementary Table S5). The P300 protein, which is encoded by the EP300 gene, is a histone acetyltransferase activator of gene expression in several systems, including the inflammatory/immune response (Revilla and Granja, 2009). RGS16 is known to interact directly with ORF3 of PCV2 and may play an important role in translocation of the ORF3 protein of PCV2 into the cell nucleus (Timmusk et al., 2009) and harbor PCV2 proteins in infected cells (Vincent et al., 2003, 2005, 2007). Additionally, the RGS16 gene is upregulated in immature dendritic cells (Shi et al., 2004), in which PCV2 can persist (Vincent et al., 2003), and RGS16 inhibits maturation of dendritic cells through TLR9 (Vincent et al., 2005). Therefore, a nonfunctional RGS16 may inhibit PCV2 infection and increase growth rate.

In the coinfection trials, pigs with the AA genotype at SNP 1 in the RGS16 gene had significantly higher RGS16 gene expression after coinfection than pigs with the AG genotype (Table 5). However, the associations of SNPs 1 and 2 with PCV2b viral load were not significant (P = 0.51 and 0.13, result not shown), although heterozygotes for SNP 2 tended to have lower PCV2b viral load than the other two genotypes. Lim et al. (2017) found that pigs with genotype AG at SNP 1 and genotype TC at SNP 2 had significantly higher PCV2b viral load than pigs with the other two genotypes. The inconsistency of the associations of SNPs in the RGS16 gene with PCV2 viral load in our coinfection study with those observed by Lim et al. (2017) might be caused by differences in the nature of the PCV2 infection between the two studies, that is, PRRSV/PCV2b coinfection vs. a natural PCV2-only infection with an unknown strain for Lim et al. (2017). In our PRRSV-only infection trials, pigs with the AA genotype at SNP 1 in the RGS16 gene tended to have higher PRRS viral load than pigs with the other two genotypes (Table 1) but these differences were not significant. In conclusion, in both the PRRSV-only and the coinfection trials, the G allele at SNP 1 and the CT genotype at SNP 2 in the RGS16 gene appeared to be favorable, with lower PCV2b viral load compared to the other two genotypes. This suggests that there might be two QTL with different effects around these two SNPs.

Effects at RGS16 depend on genotype at GBP5

Interestingly, for both the PRRSV-only infection trials and the PRRSV/PCV2b coinfection trials, SNP 2 showed a significant interaction with WUR genotype on weight gain (Figure 2A) and weight gain postvaccination (Figure 2H), respectively, which suggests that RGS16 may interact with GBP5. Such interactions were found in RAW 264.7 macrophages, in which both single treatment with IFN- β and dual treatment of IFN- β and KDO (2-keto-3-deoxyoctonate, a ligand that binds TLR4) increased GBP5 gene expression and decreased RGS16 gene expression (dual treatment only; Krishnan and Choi, 2012). Interestingly, the average correlation between GBP5 and RGS16 gene expression was negative across time points before coinfection (0.83±0.32, P = 0.08) but not after coinfection (0.33±0.47, P = 0.53). Moreover, we did not identify significant interactions between genotype at WUR and genotypes at either of the RGS16 SNPs on RGS16 gene expression, either before or after coinfection.

Effects at TRAF1

The TRAF1 gene is a negative regulator of TNF signaling in T lymphocytes (Tsitsikov et al., 2001). No SNP in TRAF1 was significantly associated with any trait in either the PRRSV-only or the coinfection trials. This may in part be due to the low MAF at these SNPs: 0.003 in the coinfection trials and 0.10 in the PRRSV-only trials. In the PRRSV-only infection trials, P were 0.53 for PRRS viral load and 0.13 for weight gain. However, the 1 Mb window that contains TRAF1 did explain 0.9% of the genetic variation for PRRS viral load in the PRRSV-only trials. This window was also identified to be associated with PRRS viral load of NVSL in our previous genome-wide association study of the PRRSV-only trials (Waide et al., 2017), noting that this window was mapped to 292-293 Mb on chromosome 1 in build 10.2 of the swine genome that was used in that study. Of the top ten SNPs in the TRAF1 window with associations with PRRS viral load, six are located in the CDK5RAP2 gene (ASGA0007320, ALGA0009926, M1GA0001522, DIAS0000208, H3GA0004641, and ASGA0007309). A previous study has suggested that mutations in the CDK5RAP2 gene play roles in impaired centrosomal function and mitotic progression with abnormal mitotic spindle orientation in humans (Lizarraga et al., 2010). Loss of CDK5RAP2 showed smaller cerebral organoids containing fewer neural progenitor cells with aberrant cell polarity in humans (Gharbaran and Somenarain, 2019). The SNP DRGA0002443 in this same 1 Mb window is located in the MEGF9 gene and was associated with PRRS viral load. MEGF9 is a transmembrane protein with multiple EGF-like domains and could play a role in the development and maintenance of the nervous system (Brandt-Bohne et al., 2007). Highly pathogenetic PRRSV infection causes severe neurological symptoms such as shivering and PRRSV has been identified in the brain of PRRSV-infected piglets (Tian et al., 2007). Mutations

in both the CDK5RAP2 and MEGF9 genes may cause aberrant nervous system symptoms through the change of their gene expression under PRRSV infection.

Conclusions

We identified and evaluated the associations of natural SNPs in four candidate genes, CD163, CD169, TRAF1, and RGS16, with host response to PRRSV and/or PCV2b infection. Several SNPs in the CD163, CD169, and RGS16 genes showed significant associations with PRRSV and/or PCV2b viral load, and/or growth rate following PRRSV-only infection or PRRSV/PCV2b coinfection and PRRS vaccination. All the SNPs in the CD163 and CD169 genes that were significant in the PRRSV-only infection trials had significant interaction effects with the genetic backgrounds evaluated. In general, we suggest that selection of heterozygotes of SNPs 5, 11_12_13, 15, 18, and 19 in the CD163 gene, for the G allele at SNP 1 in the CD169 gene, and for the G allele at SNP 1 in the RGS16 gene is expected to improve host response to PRRSV and/or PCV2 infection. Additionally, several SNPs in the CD163, CD169, and RGS16 genes showed significant interaction effects with genotype at the WUR SNP, which is in almost complete LD with the putative causative mutation for PRRS resistance in the GBP5 gene. This suggests a biological interaction between GBP5 and these candidate genes. Additional research is needed to confirm these findings and understand the mechanisms behind the effects of these SNPs on PRRS and/or PCV2 viral load, and/or growth rate following (co-)infection.

Supplementary Data

Supplementary data are available at *Journal of Animal Science* online.

Acknowledgments

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Conflict of interest statement

The authors declare they have no competing interests.

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