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Abstract

Salmonella in swine is a major food safety problem, as the majority of US swine herds are *Salmonella*-positive. *Salmonella* can be shed from colonized swine and contaminate (i) neighbouring pigs; (ii) slaughter plants and pork products; (iii) edible crops when swine manure is used as a fertilizer; and (iv) water supplies if manure used as crop fertilizer runs off into streams and waterways. A potentially powerful method of addressing pre-harvest food safety at the farm level is through genetic improvement of disease resistance in animals. In this research, we describe a successful strategy for discovering genetic variation at candidate genes associated with disease resistance in pigs. This involves integrating our recent global gene expression analysis of the porcine response to *Salmonella* with information from the literature about important candidate genes. We identified single-nucleotide polymorphisms (SNPs) in these functional candidate genes and genotyped three independent pig populations that had data on *Salmonella* faecal shedding or internal burden (total $n = 377$) at these loci. Of 31 SNPs genotyped, 21 SNPs segregated in at least two populations with a minor allele frequency of 15% or greater. Statistical analysis revealed thirteen SNPs associated with *Salmonella* faecal shedding or tissue colonization, with an estimated proportion of false positives (PFP) ≤ 0.2 . The genes with associated SNPs included *GNG3*, *NCF2*, *TAP1*, *VCL*, *AMT*, *CCR1*, *CD163*, *CCT7*, *EMP1* and *ACP2*. These associations provide new information about the mechanisms of porcine host response to *Salmonella* and may be useful in improving genetic resistance to this bacterium.

Keywords

disease resistance, *Salmonella*, shedding, single-nucleotide polymorphism

Disciplines

Epidemiology | Food Processing | Genetics and Genomics | Large or Food Animal and Equine Medicine | Veterinary Preventive Medicine, Epidemiology, and Public Health

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Integrating comparative expression profiling data and association of SNPs with *Salmonella* shedding for improved food safety and porcine disease resistance

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Summary

Salmonella in swine is a major food safety problem, as the majority of US swine herds are *Salmonella*-positive. *Salmonella* can be shed from colonized swine and contaminate (i) neighbouring pigs; (ii) slaughter plants and pork products; (iii) edible crops when swine manure is used as a fertilizer; and (iv) water supplies if manure used as crop fertilizer runs off into streams and waterways. A potentially powerful method of addressing pre-harvest food safety at the farm level is through genetic improvement of disease resistance in animals. In this research, we describe a successful strategy for discovering genetic variation at candidate genes associated with disease resistance in pigs. This involves integrating our recent global gene expression analysis of the porcine response to *Salmonella* with information from the literature about important candidate genes. We identified single-nucleotide polymorphisms (SNPs) in these functional candidate genes and genotyped three independent pig populations that had data on *Salmonella* faecal shedding or internal burden (total $n = 377$) at these loci. Of 31 SNPs genotyped, 21 SNPs segregated in at least two populations with a minor allele frequency of 15% or greater. Statistical analysis revealed thirteen SNPs associated with *Salmonella* faecal shedding or tissue colonization, with an estimated proportion of false positives (FP) ≤ 0.2 . The genes with associated SNPs included *GNG3*, *NCF2*, *TAP1*, *VCL*, *AMT*, *CCR1*, *CD163*, *CCT7*, *EMP1* and *ACP2*. These associations provide new information about the mechanisms of porcine host response to *Salmonella* and may be useful in improving genetic resistance to this bacterium.

Keywords disease resistance, *Salmonella*, shedding, single-nucleotide polymorphism.

Introduction

Swine that shed pathogenic bacteria such as *Salmonella enterica* on the farm or at the slaughter plant can negatively affect pre-harvest food safety (Ebner & Mathew 2000; Hurd *et al.* 2001). Human health costs attributed to foodborne *Salmonella* are estimated to be \$ 2.9 billion annually (Miller *et al.* 2005). The proportion of human salmonellosis cases

that is attributed to pork was estimated at 15% in the Netherlands and 9% in Denmark (see references in Miller *et al.* 2005). While the proportion of the pork-related salmonellosis cases in the United States has not been estimated, about 7% of US market hog carcasses sampled between 1998 and 2000 were contaminated with *Salmonella* (Rigney *et al.* 2004). Furthermore, a survey performed by the USDA National Animal Health Monitoring System in 2006 indicated that about 53% of pig farm sites sampled in 17 states of the United States were positive for *Salmonella* (APHIS 2009). A challenge in controlling *Salmonella* contamination on the farm and in the food chain is identifying asymptomatic *Salmonella* carrier animals that shed bacteria in their faeces, leading to contamination of the environment and non-infected pigs (Hurd *et al.* 2001; Perron *et al.* 2008;

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Boyen *et al.* 2008). High levels of *Salmonella* detected in carcasses have been positively correlated with both *Salmonella* shedding by carrier swine and *Salmonella* prevalence on a farm (Nollet *et al.* 2005). Control of foodborne *Salmonella* within the farm-retail continuum is a complex issue. In addition to meat contamination, when manure from farms with *Salmonella* carrier animals is used as fertilizer, it can contaminate edible crops and/or run into human water sources, posing additional food safety issues (Guan & Holley 2003). Thus, reduction in the risk of foodborne disease at the farm level is an essential step in providing pathogen-free products, including both meat and non-meat products, such as fruits and vegetables, to consumers. A variety of methods to reduce on-farm *Salmonella* prevalence have been employed, including feed management practices, vaccination, and the use of antibiotics; however, many such methods have economic or public health issues (Denagamage *et al.* 2007; O'Connor *et al.* 2008; Perron *et al.* 2008). A potentially effective method of addressing *Salmonella* control and pre-harvest food safety issues is through genetic improvement of disease resistance in animals to decrease the incidence of *Salmonella* at the beginning of the food chain.

Genetic variation in the porcine immune response has been reported in several studies, and it has been shown that porcine immunity and/or disease resistance is under significant genetic control (Sellwood 1979; Rothschild *et al.* 1984; Meijerink *et al.* 2000; Gibson & Bishop 2005; Galina-Pantoja *et al.* 2006; Petry *et al.* 2007; Clapperton *et al.* 2009; Reiner *et al.* 2007, 2010). Several quantitative trait loci (QTL) associated with immune capacity in the pig have been identified, including QTL for total white blood cell and leucocyte numbers, mitogen-induced proliferation, levels of pre-vaccination antibodies to *Escherichia coli*, and stress-induced immune response. In addition, QTL have been found for porcine humoral innate immune response and cytokine concentration (Edfors-Lilja *et al.* 1998, 2000; Reiner *et al.* 2008; Wimmers *et al.* 2009; Lu *et al.* 2010). Several immune traits have been suggested as predictors of swine health status, including acute phase protein alpha-1 acid glycoprotein levels and numbers of peripheral blood mononuclear leucocyte subsets such as CD11R1⁺ cells (Clapperton *et al.* 2009). In addition, several inherited immunological traits such as number and function of polymorphonuclear leucocytes (PMNs) were shown to affect porcine resistance to *Salmonella* (van Diemen *et al.* 2002). Further, chromosomal regions have been identified that are associated with *S. enterica* serovar Choleraesuis (SC) spleen and liver colonization at 7 days post-challenge in F₂ offspring of a boar thought to be heterozygous for genes involved in *Salmonella* susceptibility (Galina-Pantoja *et al.* 2009). Effects of selection on porcine adaptive immune response have been analysed by developing high immune response and low immune response porcine lines selected for a combination of humoral and cellular response measures (Mallard *et al.* 1992; Wilkie & Mallard 1999; Crawley

et al. 2005). Altogether, these studies indicate that there is measurable genetic control of immune traits that leads to variation in disease progression and pathogenesis. However, the specific genes, genetic variants and pathways that are involved in controlling such variation in porcine response and resistance to *Salmonella* have not been identified. Recent microarray gene expression profiling from pig mesenteric lymph node examined the porcine transcriptional response to SC and *S. enterica* serovar Typhimurium (ST) infections (Wang *et al.* 2007, 2008). In the research reported here, we used this global gene expression data to select candidate genes and analyse SNPs in genes whose expression levels respond to both *Salmonella* serovars. These genes and their variants are likely to be important in host response to *Salmonella* serovars found in the field. We also genotyped three porcine populations with a total of 377 animals and identified associations of the SNPs with *Salmonella* shedding and/or tissue colonization.

Materials and methods

Porcine populations

The three porcine populations with qualitative or quantitative *Salmonella* shedding and/or tissue colonization phenotypes that were used in this study are as follows:

Field population

A survey of swine farms in Iowa, USA, resulted in the collection of tissues as well as *Salmonella* faecal shedding data for >7000 animals (Wang *et al.* 2010). Faecal samples were collected seven days before marketing, and samples were tested for *Salmonella* presence as described later. Within a subset of approximately 1000 pigs of this population, we obtained tissue samples and isolated genomic DNA from 52 faecal positive pigs and 57 faecal negative control pigs. These controls were selected from the cohort of animals collected on that farm and day where a positive case was found; where possible, we used an animal collected near the positive sample. For genotyping, we used these 109 field population pigs.

IAH-Compton population

This experimental challenge population contained a total of 228 pigs that included multiple specific sire families of commercial pigs as previously described (van Diemen *et al.* 2002). Briefly, first-generation offspring of two boars that were potentially susceptible and resistant as well as two unknown boars were experimentally infected with *S. choleraesuis* followed by enumeration of bacteria in liver and spleen 7 days post-infection. The phenotypic data and DNA samples from this population were a gift from the Pig Improvement Company.

National Animal Disease Center (NADC) population

This experimental challenge population contained 40 mixed breed pigs that were experimentally inoculated with *S. Typhimurium*; details on this experiment have been reported previously (Uthe *et al.* 2009). Briefly, at days 2, 7, 14 and 21 post-inoculation (pi), quantitative *Salmonella* faecal shedding data were collected. At day 21 pi, ileo-caecal lymph nodes were collected, and qualitative *Salmonella* presence or absence in this tissue was determined as described (Uthe *et al.* 2009). All procedures involving animals were lawful and approved by the USDA, ARS, NADC Animal Care and Use Committee.

Sample collection and *Salmonella* bacteriology

For the field population, individual faecal samples (20–30 g) were collected into labelled plastic bags at the same time as animals were tattooed (Wang *et al.* 2010). Matched belly flap samples were collected at the abattoir from dressed carcasses using the unique slap tattoo number. Belly flap samples were placed in plastic bags and frozen for later DNA preparation. To identify pigs shedding *Salmonella*, qualitative bacteriology was performed as follows: 10 g samples of swine faeces were assayed in duplicate using *Salmonella* enrichment and selective media as previously described (Hurd *et al.* 2002). Positive isolates were confirmed by serogroup antiserum agglutination assays.

DNA isolation

To isolate DNA from belly flaps (field) and liver tissues (NADC), about 20 mg of tissue samples was digested with proteinase K (Invitrogen, Carlsbad, CA, USA). DNA from tissue lysates was extracted using Wizard SV genomic DNA purification system (Promega, Madison, WI, USA) according to the manufacturer's protocol. DNA was quantified by Nanodrop (Thermo Scientific, Wilmington, DE, USA), and DNA quality was checked by A260/A280 ratios and agarose gel electrophoresis.

Selection of functionally relevant genes for SNP analysis

Our gene and putative SNP selection criteria were as follows:

- 1 Genes that are differentially regulated early, at 8–48 h during both ST and SC infections in pigs (Wang *et al.* 2007, 2008). All annotated genes that showed a difference in expression of at least 1.5-fold when comparing infected animals to uninfected controls and with a q -value < 0.24 were considered, as these criteria we used in the original studies.

- 2 Genes that, based on published data (Jenner & Young 2005), are involved in the response of the organism to multiple bacterial pathogens.

- 3 Genes whose expression is known to be 'non-tolerizable' or non-diminished during continuing re-infection, as such genes are more likely to be involved in clearance of bacterial pathogens (Foster *et al.* 2007).

This approach identified 223 candidate genes, with 32 of them found in the Jenner and Young list of common host response genes, two genes reported as non-tolerizable, as well as seven genes coming from the combination of the lists above (Fig. 1 and Table S2). This candidate gene list was expanded by adding genes that are differentially expressed in porcine whole blood RNA 2 days after inoculation with ST (Huang *et al.*, manuscript in preparation, Table S2). In this experimental ST challenge study, pigs that stopped shedding the bacteria after day 7 of the experiment were called low shedders, and pigs that continued shedding until the end of the 21-day study were called persistent shedders. The 62 genes were chosen based on Affymetrix analysis and were those genes with q -value < 0.1 for shed class by infection interaction and ≥ 1.5 -fold change because of infection, expressed in the opposite direction for low shedder versus persistent shedder pigs (Huang *et al.*, manuscript in preparation).

Identification of SNPs in functional candidate genes and SNP genotyping

Putative SNPs in the selected genes were identified using the Pig Expression Data Explorer (PEDE, <http://pede.dna.affrc.go.jp/>) or Dana-Farber Cancer Institute (DFCI) Pig Gene Index databases (<http://compbio.dfc.harvard.edu/tgi/cgi-bin/tgi/gimain.pl?gudb=pig>). From the databases, we selected sequences with putative SNPs, requiring a minimum of three counts of the minor allele that was different from the allele in the consensus sequence reported by the database.

DNA genotyping was performed by PCR–restriction fragment length polymorphism (PCR–RFLP), tetra primer

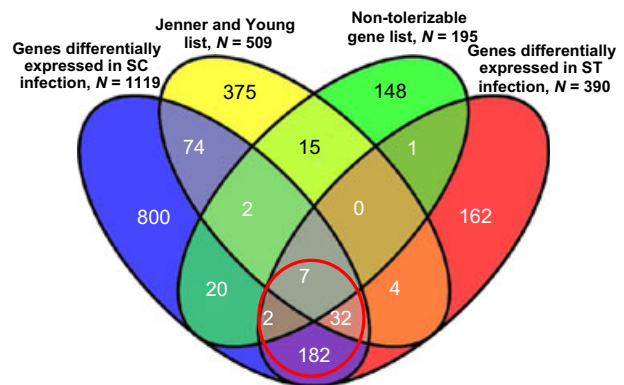


Figure 1 Selection of gene lists for the SNP analysis. Gene lists that were used for the putative SNP search are circled in red. SC and ST are abbreviations for *Salmonella* Choleraesuis and *Salmonella* Typhimurium, respectively.

amplification refractory mutation system (ARMS)-PCR and Sequenom technologies. Initially, we tested 13 predicted SNPs by PCR amplification and product sequencing of representative DNA pools from the NADC population (DNA Sequencing and Synthesis facility, Iowa State University, Ames, IA, USA). Analysis by RFLP was used to genotype the confirmed SNPs in the NADC and IAH-Compton populations (Table 1). The PCR was prepared in 15 µl volumes, and the PCR conditions were as follows: 5 min at 95 °C followed by 35 cycles of 1 min at 94 °C, 30 s at 55 °C and 1 min at 72 °C, and a final extension of 10 min at 72 °C. Enzymatic digestions followed by agarose gel electrophoresis to determine genotypes were carried out using standard protocols.

To increase genotyping throughput and efficiency, we used Sequenom MassARRAY technology (MassARRAY Compact System; Sequenom Inc., San Diego, CA, USA) for the remaining SNPs. Selection of SNPs for multiplex reaction, primer design (Table S1) and genotyping was performed using iPLEX reagent kit and the Sequenom Typer 3.1 software according to the manufacturer's instructions (Sequenom, <http://www.sequenom.com>). Assays that had a minimum of 80% of genotyping calls and minor allele frequency (MAF) of at least 15% were subsequently statistically analysed. For quality control, within the set of SNPs genotyped by Sequenom, we included 13 markers with known genotypes based on PCR-RFLP analysis of the NADC

population. The accuracy of Sequenom genotype data compared to PCR-RFLP results was 99%. Finally, tetra primer ARMS-PCR was used to genotype the *CD163* #2 SNP (NM_213976.1:c.2685C>A), as data for this SNP from Sequenom analysis were incomplete. Each PCR contained 30 ng of DNA template, 10 pmol of each inner primer, including the C allele-specific forward (5'TGTTTCAGTGTCC TAAAGGACCTGACGCC) and the A allele-specific reverse primer (5'ATGGAGATGAGGGGCACTGCCATGGT) and 1 pmol of each outer primer (forward: 5' GGACATCAGCCC TGCATCTTCAGACAAG and reverse: 5'ATGTGATCCATGT CTCCTCTGAGGGGCT). The above PCR primers were designed using tetra primer ARMS-PCR primer design software at http://cedar.genetics.soton.ac.uk/public_html/primer1.html (Ye *et al.* 2001). PCR reactions were prepared in 10 µl volumes using GoTaq Hot Start Green Master Mix (Promega, Madison, WI, USA). Touchdown PCR conditions were as follows: 2 min at 95 °C followed by 35 cycles of 1 min at 95 °C, 1 min at 75 °C for the first cycle, decreasing by 1 °C each cycle until the temperature of 60 °C was reached and continuing at that annealing temperature for the rest of the cycles; then 1 min at 72 °C and final extension 10 min at 72 °C. PCR products were detected by electrophoresis on an agarose gel consisting of 1:1 low EEO (Fisher Scientific, Pittsburg, PA, USA) to MetaPhor (Cambrex, East Rutherford, NJ, USA) agaroses. The presence of a 99-bp PCR product was indicative of the C

Table 1 RFLP analysis of selected polymorphisms.

Gene name and SNP	PCR primers, 5'-3'	Enzyme	PCR product (bp)	Digestion product sizes (bp)
<i>CD47/IAP</i> , NM_213982.1:c.2581G>A	f: GTGCACCTGTGTAAGTTAGGCAC; r: CAGCAAACCACTTGGTCCCAGAAT	Tsp509 I	370	A: 103, 93, 74, 48, 42, 10 bp; G: 151, 93, 74, 42, 10 bp
<i>VCP</i> #3, NM_214280.1:c.1318G>A	f: GTCGCTTTGACAGGGAGGTAG; r: TGTTC AAGGTCCACATCATCTG	BstY I	112	G: 64, 48 bp; A: no digestion
<i>LCP1</i> #1, XM_001929138.1:c.644T>C	f: CTGCCTGCTTGCCTCTG r: GATAAACTCGTCAAAGCTGATC	BtsC I	107	T: 82, 24; C: no digestion
<i>CCT7</i> #3, NM_001170522:c.1520C>T	f: GAGGACATTGCTGACAACCTCG r: GTGAGAACAGAGGGTCAAATAC	BtsC I	299	T: 188, 111 bp; C: no digestion
<i>CCR1</i> , NM_001001621.1:c.2878G>A	f: CCCATCAGCAGAACCACAAC r: GATTTATTGTCTTGGAAAGTGAT	Tsp509 I	474	G: 224, 127, 123 bp; A: 186, 127, 123, 38 bp
<i>CD163</i> #3, NM_213976.1:c.3066T>C	f: ATATGGCTCAATGAAGTGAAGTG r: GGGATTCTCGGCTCTTTGC	Afl III	504	T: 109, 207, 184 bp; C: 316, 184 bp
<i>NCF2</i> #1, NM_001123142.1:c.1419C>T	f: ACCACAGAACCTCACCTAAAG r: ATGATGTCCCCTTCCAGAAAG	Acu I	101	T: 59, 30, 12 bp; C: 71, 30 bp
<i>TYROBP</i> , NM_214202.1:c.232C>T	f: TGGTGCTGACCCCTCCTC r: CTCAGCGATGTGTTGTTTCC	Btg I	253	C: 70, 183 bp; T: no digestion.
<i>TAP1</i> #2, NM_001044581.1:c.448A>G	f: CTTTCCATAAACCGCTTGCTTC r: CAGAGCCTCTGTGACTTCTTG	HpyCH4V	702	A: 587, 53, 40, 22 bp; G: 587, 93, 22 bp
<i>ACP2</i> #3, ITC.59388.1004:c.644G>A	f: TTGAGCAGCTGCAGAACGAG r: GAGTGTGCATAGACATTCCAG	Sau96 I	226	A: 153, 74 bp; G: 111, 74, 42 bp

The PCR-RFLP assay for *CCT7* #2 SNP was reported in Uthe *et al.* 2009.

allele, a 110-bp product indicated the A allele, and the outer primers always produced a 155-bp product.

Statistical analysis

Statistical association analysis of genotype and *Salmonella* shedding and/or tissue colonization phenotype was performed in the statistical computing environment R, with all code available upon request. Because of small sample sizes and non-normal distributions, permutation-based hypothesis testing was used to assess the significance of association between each SNP and each phenotype in each population separately. Within each population, the test statistic used for permutation testing was carefully chosen based on the nature of the phenotype and the structure of block factors unique to each population, as described in later subsections. Regardless of the test statistic selected, permutation testing was carried out for each population, phenotype and SNP as follows. First, the test statistic was computed for the original data. Then, SNP genotypes were randomly shuffled 19 999 times within the levels of the available block factor(s). The test statistic was recomputed for each of these 19 999 data sets. The resulting 20 000 test statistics provided a reference distribution under the null hypothesis of no association. A permutation *P*-value was computed as the proportion of these 20 000 statistics that were as extreme as or more extreme than the statistic observed for the original data.

Besides analysing each SNP of interest separately, SNPs that lie within the same gene were also assessed for joint association. Each joint SNP was first treated as a single multilevel factor (up to nine levels) and was analysed in the same way as other SNPs. To further improve statistical power by recovering some inter-block information, the permutation *P*-value of this joint SNP together with permutation *P*-values from the individual SNPs in the same gene were then combined using Fisher's combination function, i.e. the geometric mean function. The same combination procedure was applied to all other 19 999 permutations. The final permutation *P*-value for the joint SNP was computed as the proportion of permutations that had a combined *P*-value no larger than the one obtained in the original data (Pesarin 2001).

Because of multiple hypothesis tests performed in the analyses, we controlled SNP false discovery rates (FDR) from the set of *P*-values for each trait in each population separately, using a procedure similar to Storey & Tibshirani (2003). The default smoother method used by Storey & Tibshirani (2003) was not stable because we had only dozens of *P*-values. Thus, we chose to set the lambda parameter discussed by Storey & Tibshirani (2003) to be the observed *P*-value such that the difference between the *P*-value itself and the empirical distribution function evaluated at this *P*-value was maximum. When the number of *P*-values is large, this modification results in more conser-

vative FDR control, i.e. it controls FDR by providing a wider safety margin. Note that this FDR estimator also provides a natural estimate of the proportion of false positives (PFP) (Fernando *et al.* 2004). Hence, even though the multiple testing procedure was applied to each phenotype-by-population combination separately, the procedure also provides a reasonable estimate of PFP when all hypotheses in the currently study are considered together.

Details specific to each population are as follows:

Field population

The binary *Salmonella* shedding status trait was used as the response variable. A logistic regression model was used with farm-and-visit combination as a block factor and SNP as a fixed factor of interest. Because of complete separation of the binary trait with either block or the SNP of interest, not all maximum likelihood estimates of parameters were finite. Hence, Firth's penalized likelihood method was used for parameter estimation (Firth 1993). The modified (Rao's) score statistic was computed for the SNP of interest, based on Firth's modified score equation (Heinze & Schemper 2002).

IAH-Compton population

Two log-transformed count traits, spleen counts (splC) and liver counts (livC), were analysed separately for each SNP. Each of 39 combinations of group, sire and dam was treated as a distinct level of a block factor. The test statistic was chosen to be the weighted average of the within-SNP-genotype pairwise Euclidean distances (see the MRBP statistic proposed by Mielke & Berry 2007).

NADC population

The phenotypes for this population included a univariate binary ileo-caecal lymph node (ICLN) trait and a 4-dimensional (four time points pi) shedding count trait. Sow was the only block factor. For the binary ICLN trait, a permutation-based likelihood ratio test was used to separately test the association of each SNP with the binary response in a logistic regression model. For each SNP being analysed, log likelihood ratio statistic was calculated by comparing the maximized log likelihood from the model with the sow as the only fixed factor and the model with both the sow and the SNP being analysed as fixed factors. The 4-dimensional shedding count trait was transformed by taking natural logarithms after adding one to each count to avoid infinite logarithms. The test statistic for the 4-dimensional shedding count trait was calculated as the weighted mean of within-genotype average pairwise Euclidean distances of pigs, with weights being the number of pigs within the same SNP genotype (see the MRBP statistic of Mielke & Berry 2007) (Appendix S1).

Results

Identification of functionally relevant candidate genes for improving resistance to *Salmonella*

Expression profiling by our research team of the porcine response to *Salmonella* (Wang *et al.* 2007, 2008) has identified genes differentially regulated in pig mesenteric lymph nodes at various stages during *Salmonella* infection from acute (8 hr post-inoculation (p.i.) to the chronic (21 days p.i.) stages. This microarray analysis of mesenteric lymph node gene expression was chosen as the most comprehensive published study on porcine transcriptional response to *Salmonella* and provides large lists of genes responding to two different *Salmonella* serovars (SC and ST) to be screened to select candidate markers for SNP analysis. Aiming to identify genes that would be involved in controlling porcine response to infection under different conditions at different farms, we also attempted to select genes that commonly respond to bacterial pathogens using information from the literature. Global gene expression analysis in response to *Salmonella* and other pathogens is available in other animal species including chicken (Zhou & Lamont 2007; Chiang *et al.* 2008; Zhang *et al.* 2008). Cross-species comparison of microarray data is complex because of the variety of tissues or cells and various microarray platforms used, as well as the logistics of identifying orthologs to microarray elements in other species. Thus, we focused on using our *Salmonella* response transcriptomics data that is directly relevant to porcine resistance. However, as an additional level for selecting genes, we opted to use a well-described common host response gene list by Jenner & Young (2005). The authors analysed a wide range of microarray experiments in a variety of human cells, thus encompassing genes generally responsive to pathogenic stimulus in mammalian cells. As an additional level in choosing genes, we used a non-tolerizable gene list described by Foster *et al.* (2007), attempting to prioritize genes that may be involved in clearance of the bacteria. Figure 1 shows the total number of genes found under each of the above criteria and the intersections of each. In addition, we selected 62 genes that by Affymetrix microarray analysis were found to be differentially regulated in porcine whole blood two days after inoculation with ST in two different classes of pigs that differ in faecal shedding phenotypes (Huang *et al.*, manuscript in preparation, Table S2; see Methods). In total, we selected 285 genes for SNP identification and analysis.

SNP genotyping in functionally relevant genes

From the selected candidates, we chose genes that, based on PEDE or DFCI databases, had a putative SNP with a minimum of three counts of the minor allele that was different from the allele on the consensus sequence. In many cases, the SNP was confirmed by initial sequencing. Thus, we

selected for genotyping a set of 54 SNPs in 41 genes responding to acute *Salmonella* infection in pigs. A subset of 29 SNPs was selected for multiplex genotyping by Sequenom software, and genotyping calls were obtained for 23 SNPs through Sequenom analysis. As a check on Sequenom call accuracy, we checked eleven SNPs in this set that had been genotyped earlier in our populations by PCR-RFLP. For ten SNPs, Sequenom and previous genotype agreement frequency was 99.8%, while the assay for one SNP did not produce Sequenom results. Several SNPs that had MAF $\geq 15\%$ but low Sequenom call rate were manually completed to achieve at least 80% of allele call rates by either RFLP or tetra primer ARMS-PCR technology. In total, we genotyped 31 SNPs and confirmed 28 putative SNPs in 23 functionally relevant genes (Table 2). Twenty-four SNPs in 21 genes had a MAF of 15% or greater in one of the three populations, and 21 SNPs in eighteen genes had MAF of at least 15% in at least two of the three populations (Table 3).

Association of SNPs with *Salmonella* shedding or tissue colonization

Several SNPs were associated with *Salmonella* shedding or tissue colonization phenotypes. SNPs with an estimated q -value ≤ 0.2 were selected as statistically significant, where q -value is the estimated PFP; P -values for significant SNPs ranged from 0.002 to 0.088. In the NADC-40 population, the SNP in *AMT* was associated with quantitative faecal shedding of *S. Typhimurium* over the time course of infection with a raw P -value 0.005 and estimated q -value 0.095 (Fig. 2). In the field population, qualitative *Salmonella* shedding status was associated with SNPs in *GNG3* ($P = 0.07$, $q = 0.19$), *NCF2 #1* ($P = 0.023$, $q = 0.16$), *TAP1 #2* ($P = 0.027$, $q = 0.16$), *VCL* ($P = 0.059$, $q = 0.19$) (Fig. 3) and *CCT7 #3* ($P = 0.088$, $q = 0.20$, data not shown) as well as combined SNPs in *ACP2 #1 + 2 + 3* ($P = 0.031$, $q = 0.16$) and *CCT7 #2 + 3* ($P = 0.065$, $q = 0.19$) (Fig. 4). The association of SNPs with *Salmonella* tissue colonization phenotype was assessed using the NADC

Table 2 Summary of genotyping and association analyses.

	Porcine populations		
	NADC-40	Field	IAH-Compton
SNPs tested by Sequenom and/or RFLP	31	29	31
Genes tested	25	23	25
Informative SNPs found (MAF $\geq 15\%$)	18	18	13
Informative genes found	14	15	13
# of SNPs associated with shedding/tissue colonization ²	2	5 ¹	8

¹SNP #2 for *CCT7* was found previously (Uthe *et al.* 2009) and is not counted in this list.

²SNPs in the *ACP2* and *AMT* genes were associated in two populations.

Table 3 Genotyping analysis using the 3 porcine populations.

SNP	Nomenclature	NADC-40 population, n = 40			Field population, n = 109			Compton population, n = 228			
		Allele frequency	% pigs genotyped	Faecal counts P-value	Allele frequency	% pigs genotyped	Shedding status P-value	Allele frequency	% pigs genotyped	Spleen counts P-value	Liver counts P-value
ACP2 #1	ITC_59388.1004:c.195G>C ¹	G-36; C-64	93	0.359	G-22, C-78	91	0.189	G-25, C-75	89	0.011*	0.093*
ACP2 #2	ITC_59388.1004:c.618T>A (P11117:Glu187Asp)	T-26, A-75	100	0.565	T-26, A-74	94	0.139	T-18, A-82	99	0.024*	0.134
ACP2 #3	ITC_59388.1004:c.644G>A	A-40; G-60	90	0.481	A-31, G-69	88	0.179	A-29, G-71	83	0.022*	0.079*
ACP2 #1 + 2 + 3		-	-	0.484	-	-	0.031*	-	-	0.013*	0.089*
AMT	TC265929:c.1596A>G	G-31; A-69	100	0.005*	G-24, A-76	100	0.387	G-21, A-79	100	0.054*	0.454
BAM88	NM_213866.1:c.963C>T	T-9; C-91	93	Not anal.	T-10, C-90	96	Not anal.	T-1, C-99	100	Not anal.	Not anal.
CCR1	NM_001001621.1:c.2878G>A	A-44; G-56	100	- ²	G-49, A-51	99	0.400	G-42, A-58	100	0.139	0.021*
CC77 #2	NM_001170522:c.1026G>A	A-25; G-75	100	- ²	A-30, G-70	98	0.586	A-10, G-90	99	Not anal.	Not anal.
CC77 #3	NM_001170522:c.1520C>T	C-29; T-71	100	0.877	T-30, C-70	95	0.996	T-4, C-96	100	Not anal.	Not anal.
CC77 #2 + 3		-	-	0.751	-	-	0.065*	-	-	-	-
CD163 #2	NM_213976.1:c.2685C>A	C-75; A-25	93	0.308	C-85; A-15	93	0.291	C-82; A-18	94	0.002*	0.014*
CD163 #3	NM_213976.1:c.3066T>C	C-26; T-74	100	- ²	C-26, T-74	98	0.126	C-15, T-85	99	0.193	0.047*
CD163 #2 + 3		-	-	Not anal.	-	-	0.262	-	-	0.017*	0.038*
CDC123	TC242709:c.654G>A	A-24; G-76	100	0.546	A-27, G-73	98	0.999	A-40, G-60	99	0.432	0.627
CD47//IAP	NM_213982.1:c.2581G>A	A-10; G-90	90	- ²	A-9, G-91	29	Not anal.	A-48, G-52	100	0.901	0.871
EMP1	NM_001099940.1:c.388G>A (P:Ala130Thr)	A-15; G-85	98	0.347	A-17, G-83	98	0.833	A-0, G-100	99	Not anal.	Not anal.
GNG10	TC251588:c.659A>C	C-21; A-79	85	0.875	C-24, A-76	83	0.679	C-36, A-64	96	0.119	0.184
GNG3	TC260074:c.619T>C	C-9; T-91	98	Not anal.	C-35, T-65	98	Not anal.	C-15, T-85	99	0.992	0.834
GSTA3 #3	TC238734:c.621T>C	C-13; T-88	50	Not anal.	C-7, T-93	50	Not anal.	C-23, T-77	93	0.211	0.936
LCP1 #1	XM_001929138.1:c.644T>C	C-15; T-85	100	- ²	C-17, T-83	80	0.890	C-0, T-100	98	Not anal.	Not anal.
MGP #2	NM_214116.1:c.317C>T	T-0; C-100	60	Not anal.	T-3, C-97	67	Not anal.	T-2, C-98	43	Not anal.	Not anal.
NCF2 #1	NM_001123142.1:c.1419C>T	T-24; C-76	100	- ²	T-25, C-75	99	0.023*	T-32, C-68	99	0.662	0.662
PDXX #1	NM_213943.1:c.63C>T	T-8; C-92	95	Not anal.	T-10, C-90	95	Not anal.	T-7, C-93	78	Not anal.	Not anal.
TAP1 #2	NM_001044581.1:c.448A>G	A-14; G-86	100	0.215	A-28, G-72	96	0.027*	G-35, A-65	78	0.613	0.683
TLR4 #4	NM_001113039.1:c.617T>A	A-40; T-60	100	0.356	A-13, T-84	100	Not anal.	A-0, T-100	98	Not anal.	Not anal.
TLR4 #6	NM_001113039.1:c.968G>A	A-41; G-59	100	0.436	A-20, G-80	95	0.065	A-0, G-100	99	Not anal.	Not anal.
TYROBP	NM_214202.1:c.232C>T	C-59; T-41	100	- ²	C-70; T-30	95	0.998	C-65; T-35	99	0.113	0.112
VCL	NM_213934.1:c.21A>G	G-34; A-66	85	0.697	G-47, A-53	90	0.059*	G-11, A-89	85	Not anal.	Not anal.
VCP #3	NM_214280.1:c.1318G>A	A-31; G-69	100	- ²	A-32, G-68	99	0.842	A-25, G-75	99	0.659	0.258

¹The ITC sequence comes from annexdb.org database.

²SNP was analysed previously.

*Statistically significant, with $q \leq 0.2$.

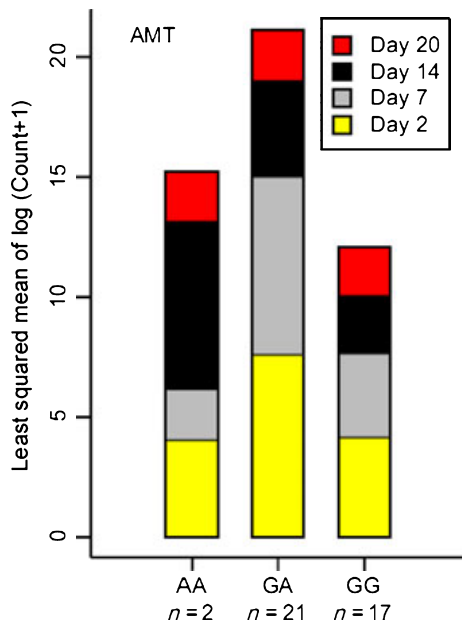


Figure 2 Association of *AMT* with *Salmonella* faecal shedding in the NADC population, $P = 0.005$, $q = 0.095$. The number below the genotype indicates the number of pigs with that genotype in the population. Y-axis indicates LS means of natural log-transformed *Salmonella* counts+1.

and IAH-Compton populations. In the NADC population, a SNP in the *EMP1* gene was associated with qualitatively measured *Salmonella* load in the ileo-caecal lymph node at 21 days post-inoculation with a raw P -value of 0.002 and

an estimated q -value of 0.041 (Fig. 5). In the IAH-Compton population, three compound SNPs in the *ACP2* gene were associated with quantitatively measured *Salmonella* burden in spleen ($P = 0.013$, $q = 0.138$) and liver ($P = 0.089$, $q = 0.15$) (Fig. 6 and data not shown). In this population, animals having homozygous G/G (*ACP2*, SNP#1, spleen $P = 0.011$, $q = 0.035$; liver $P = 0.093$, $q = 0.15$), T/T (*ACP2*, SNP #2, spleen $P = 0.024$, $q = 0.035$) and A/A (*ACP2*, SNP#3, spleen $P = 0.022$, $q = 0.035$; liver $P = 0.079$, $q = 0.15$) genotypes had the highest tissue colonization at 7 days post-inoculation with *S. choleraesuis*. A SNP in the *AMT* gene ($P = 0.054$, $q = 0.068$, data not shown) was associated with *Salmonella* burden in spleen, while a SNP in the *CCR1* gene ($P = 0.021$, $q = 0.11$) was associated with bacterial numbers in liver in the IAH-Compton population (Fig. 7). Bacterial numbers in liver and spleen were associated with *CD163* SNP #2 (liver: $P = 0.047$, $q = 0.13$) and SNP #3 (liver: $P = 0.014$, $q = 0.11$; spleen: $P = 0.002$, $q = 0.018$) (Fig. 7). The combined *CD163* SNP #1 + 3 genotypes were associated with *Salmonella* burden in both liver and spleen (liver: $P = 0.038$, $q = 0.13$; spleen: $P = 0.017$, $q = 0.035$; data not shown).

Discussion

This research focuses on the long-term goal of using the power of genomics to identify genetic variants associated with decreased tissue colonization or *Salmonella* shedding in

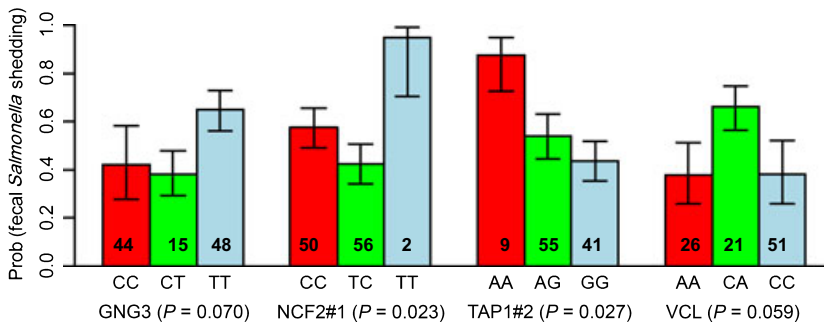


Figure 3 Association of SNPs with *Salmonella* faecal shedding in the field population. The number of pigs with each genotype is indicated on the bar graphs. Y-axis represents the fitted probability of positive faecal shedding (see Methods).

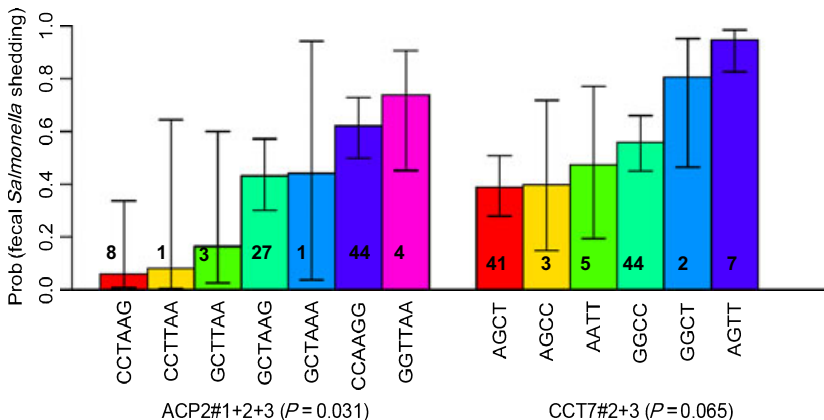


Figure 4 Association of combined SNPs in *ACP2* and *CCT7* genes with *Salmonella* faecal shedding in the field population. The number of pigs with each genotype is indicated on the bar graphs. Genotype i.e. CCTAAG means SNP 1 C/C + SNP#2 T/A + SNP#3 A/G. Y-axis represents the fitted probability of positive faecal shedding (see Methods).

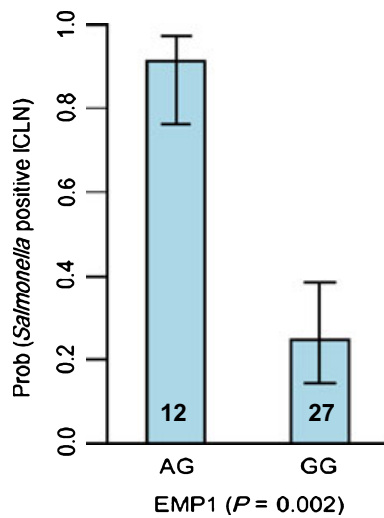


Figure 5 Association of *EMP1* with *Salmonella* load in ICLN in the NADC-40 pigs population, $P = 0.002$, $q = 0.04$. The number of pigs with each genotype is indicated on the bar graphs. Y-axis represents the fitted probability of positive ICLN.

live pigs. In addition, this is the first study to use global gene expression data and literature information on important immune response genes to select genetic polymorphisms for association with *Salmonella* colonization and shedding phenotypes in pigs. Selection of candidate genes for SNP analysis was an essential step in an investigation of this scale

that aimed to understand porcine genetic resistance to *Salmonella*. Our previous analysis of global transcriptional regulation of swine response to *Salmonella* (Wang *et al.* 2007, 2008) was particularly useful in the gene selection process. By focusing on genes that are (i) differentially regulated in both *S. Choleraesuis* and *S. Typhimurium* infections, (ii) known to respond to many types of pathogens in human cells (Jenner & Young 2005) and/or (iii) genes recently shown to be insensitive to suppression (non-tolerizeable) by repeated lipopolysaccharide (LPS) stimulation, we attempted to identify candidate genes involved in *Salmonella* as well as general porcine disease resistance. The criteria we applied were valuable in the selection of candidate genes for SNP and association analysis. In particular, four genes with confirmed SNPs were selected as belonging to a common host response gene list by Jenner & Young (2005), and SNPs in three of those genes were associated with *Salmonella*-related phenotypes, indicating the usefulness of this gene selection criterion. However, SNPs in genes that were non-tolerizeable (nine genes out of 223) were either not found or not confirmed in our pig populations by initial pre-screening. In all, while global gene expression data provided novel lists of genes potentially controlling *Salmonella* colonization and shedding in pigs, general immune response pathways reported by Jenner & Young (2005) were useful to focus on particular immune genes.

Of similar importance to defining the most appropriate candidate genes is developing test populations with relevant

Figure 6 Association of SNPs in the *ACP2* gene with spleen *Salmonella* load in the IAH-Compton population (*ACP2* SNP 1, $P = 0.011$, $q = 0.035$; SNP #2, $P = 0.024$, $q = 0.035$; SNP #3, $P = 0.022$, $q = 0.035$; and combined SNP #1 + 2 + 3, $P = 0.013$, $q = 0.138$). The number of pigs with each genotype is indicated on the bar graphs. Genotype i.e. CCAAAG means SNP #1 C/C + SNP#2 A/A + SNP#3 A/G. Y-axis indicates LS mean of \log_{10} of *Salmonella* counts.

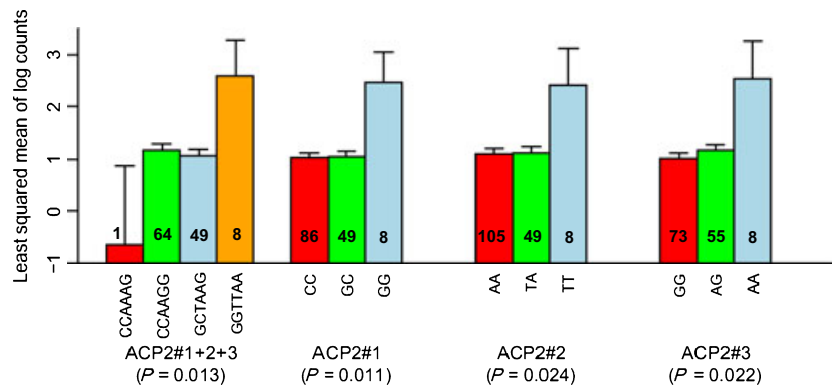
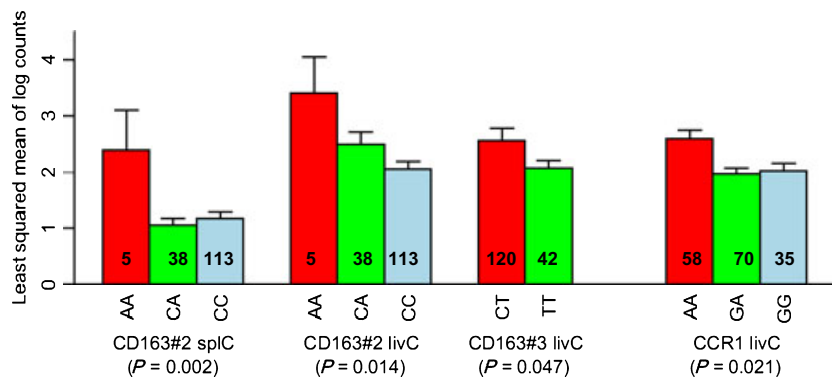


Figure 7 Association of SNPs in the *CD163* (SNP 2 liver: $P = 0.047$, $q = 0.13$ and SNP #3 liver: $P = 0.014$, $q = 0.11$; spleen: $P = 0.002$, $q = 0.018$) and *CCR1* ($P = 0.021$, $q = 0.11$) genes with spleen and liver *Salmonella* colonization in the IAH-Compton population. The number of pigs with each genotype is indicated on the bar graphs. Y-axis indicates LS mean of \log_{10} of *Salmonella* counts.



phenotypic records. It is very difficult to create substantive data sets for infectious disease work in large food animals, because of the great expense and substantial logistical work needed to collect data from natural or experimental challenge populations. We were able to gain access to the largest experimental challenge population samples that have been published for *Salmonella* infection in pigs, the IAH-Compton study (van Diemen *et al.* 2002), as well as develop an additional challenge population (NADC). We also sampled a field population, in the process creating a unique data set for genetic association with naturally occurring infections in the farm setting. These three porcine populations provided a total of 377 pigs with quantitative as well as qualitative phenotypes related to exposure to a variety of *Salmonella*, including *S. Typhimurium* (NADC), *S. Choleraesuis* (IAH-Compton) and untyped *Salmonella* from Iowa farms (field population).

The analysis revealed several SNPs in our selected genes that were associated with *Salmonella* shedding or tissue colonization phenotypes. The genes with associated SNPs are involved in a variety of cellular functions. The *AMT* genotype was associated with faecal *Salmonella* shedding over time in the NADC population, where pigs with G/G genotype had about 64-fold less bacteria compared to G/A pigs (Fig. 2). Consistent with this finding, we observed an association of *AMT* with *Salmonella* load in spleen in the IAH-Compton population as well; however, this association is based on a single pig with the A/A genotype that had about 120- to 300-fold higher numbers of bacteria compared with G/A and G/G pigs, respectively (data not shown). The *AMT* gene codes for aminomethyltransferase, which is involved in the mitochondria-specific enzyme system for cleavage of glycine (Applegarth & Toone 2006). Mutations in the *AMT* gene have been implicated in accumulation of glycine in body fluids, leading to a pathology known as non-ketotic hyperglycinemia (Kure *et al.* 2006). A role of *AMT* or its polymorphisms in infection has not been identified, yet we showed that this gene was upregulated 1.5-fold in whole blood from pigs that did not shed *Salmonella* in their faeces past 7 days of experimental inoculation and was 1.6-fold downregulated in pigs that shed bacteria throughout the 21-day experiment (Huang *et al.*, manuscript in preparation).

Genotypes in several genes were associated with the frequency of *Salmonella*-positive animals in the field population (Figs 3 & 4). The *GNG3* gene product (guanine nucleotide exchange factor gamma 3) is involved in a variety of receptor signalling pathways (Kelly *et al.* 2008). *GNG3* also stimulates the effectiveness of CD4-T-cell dependent immune response, as shown by an increase in antibody production in wild type compared to *GNG3* knock-out mice (Dubeykovskiy *et al.* 2006). Thus, *GNG3* may play a role in *Salmonella* infection, as CD4-T cells are known to be involved in defence against *Salmonella*. In our research, the expression of *GNG3* was diminished 1.5-fold

in pigs that shed *Salmonella* throughout the 21-day experiment, while it was twofold increased in pigs that stopped shedding bacteria after 7 days p.i. (Huang *et al.* manuscript in preparation). Another *Salmonella* shedding-associated SNP was found in *neutrophil cytosolic factor 2* (*NCF2*), a gene encoding a cytosolic subunit of neutrophil NADPH oxidase, which produces superoxide anions that are delivered to the neutrophil phagosome for their microbicidal effects (Ammons *et al.* 2007). Oxidative burst capacity of PMNs was shown to affect resistance of pigs to infection with *S. Choleraesuis* (van Diemen *et al.* 2002), and thus, *NCF2* gene function may be directly involved in this process. In mice, *NCF2* was suggested as a candidate gene for the *Ity3* (*immunity to Typhimurium*) locus-mediated *Salmonella* resistance (Sancho-Shimizu & Malo 2006). Researchers found that variation in *NCF2* sequence in mice resulted in reduction of superoxide production in response to infection with *S. Typhimurium*. While our permutation analysis indicated significant association of *NCF2* SNPs with *Salmonella* shedding, only two pigs with a rare A/A genotype were 100% positive for *Salmonella*. This may reflect an insufficient sampling of the population or, potentially, some deleterious effect of the A/A genotype on swine health; the latter possibility is less likely. A SNP associated with *Salmonella* shedding was found in the *transporter associated with antigen processing 1* (*TAP1*) gene that belongs to a superfamily of ATP-binding cassette transporters and is involved in transporting cytosolic peptides across the endoplasmic reticulum where they are loaded on major histocompatibility complex class I molecules (Schölz & Tampé 2009). The RNA for *TAP1* was up-regulated about twofold at 24–48 h pi with *S. Typhimurium* and *S. Choleraesuis*. In addition, *TAP1* is known to be involved in response to multiple pathogens in human cells. Polymorphisms in the *TAP1* gene have been linked to effects on the outcome of viral or parasitic infections as well as cancers (Soundravally & Hoti 2008; Aquino-Galvez *et al.* 2008). We also found genotypes in the *VCL* gene associated with shedding. The *VCL* gene codes for vinculin, a cytoskeletal protein that, through integrins, can couple the extracellular matrix with the actin-myosin cytoskeleton and is therefore implicated in cell adherence and motility (Mierke 2009). As actin polymerization is an essential step in *Salmonella*-mediated intracellular invasion, vinculin may play an important role in this process by affecting actin dynamics (Finlay & Brumell 2000; Wen *et al.* 2009). We have found that *VCL* was upregulated twofold in pigs shedding *Salmonella* throughout the 21-day experiment and downregulated fivefold in pigs that cleared the bacteria after day seven pi (Huang *et al.*, manuscript in preparation); however, a direct link between *Salmonella* infection and vinculin has not been made previously. Finally, *CCT7* (chaperonin containing TCP1, subunit seven, encoded by *CCT7*) is a chaperone involved in cytoskeleton protein folding (Valpuesta *et al.* 2002). In our previous

research, SNP #2 (NM_001170522:c.1026G>A) of the *CCT7* gene was associated with *Salmonella* shedding in the NADC population (Uthe *et al.* 2009). Here, we extended this observation by confirming an additional SNP #3 in the coding sequence of *CCT7* and identified association of the combined *CCT7* SNP #2 + #3 genotype with *Salmonella* incidence in the field population (Fig. 4).

A SNP associated with *Salmonella* load in ileo-caecal lymph node was found in the *EMP1* gene, where pigs with the G/A *EMP1* genotype were twice as likely to be ICLN-positive for *Salmonella* compared to G/G pigs (Fig. 5). In addition, polymorphism in *EMP1* results in a non-synonymous amino acid substitution from alanine to threonine at position 130. *EMP1* was chosen for this study because gene expression was induced in pigs by both *S. Typhimurium* (Wang *et al.* 2007) and *S. Choleraesuis* (Wang *et al.* 2008) 1.6-fold (48 h pi) and twofold (24 h pi), respectively. The *EMP1* gene encodes epithelial membrane protein 1, which is involved in regulation of cell adhesion, cell signalling and cell communication (Jetten & Suter 2000; Wang *et al.* 2003). Cross-talk between *EMP1* and epithelial growth factor receptor signalling has been described (Jain *et al.* 2005). Furthermore, *EMP1* is a gene known to be involved in response to multiple bacterial pathogens (Jenner & Young 2005). However, a role of *EMP1* in infectious disease is unknown.

Specific genotypes associated with both *Salmonella* burden in spleen and liver in the IAH-Compton population as well as *Salmonella* faecal shedding in the field population were found in the *ACP2* gene (Fig. 4 & 6). Approximately 20- to 50-fold more bacteria in spleen were found in animals that were homozygous for specific *ACP2* SNPs when compared to the other homozygous genotype (Fig. 6). Several haplotypes could be predicted from the three observed compound homozygous genotypes in *ACP2*. Thus, pigs with GGTTAA genotype (GTA haplotype) are estimated to have a much higher spleen burden when compared to pigs without the GTA haplotype. For example, GGTTAA animals in the IAH-Compton population have about 32-fold more bacteria compared to CCAAGG animals (Fig. 6). Interestingly, the GGTTAA animals in the field population also have the highest estimated incidence of bacterial shedding, suggesting that the GTA haplotype could predict pigs with a diminished ability to control *Salmonella* infections. Microarray analysis revealed the upregulation of *ACP2* expression by about twofold at 48 h post-inoculation with both *S. Typhimurium* and *S. Choleraesuis* (Wang *et al.* 2007, 2008). The gene encodes acid lysosomal phosphatase, which is expressed in lysosomal compartments in all tissues and is involved in phosphomonoester cleavage (Moss *et al.* 1995). One of our associated SNPs in this gene, *ACP2* SNP #2, causes an amino acid substitution from glutamate to aspartate at position 187. A mutation in the *ACP2* gene has been previously described in mice (Mannan *et al.* 2004; Saftig *et al.* 1997). It was found that the non-synonymous

SNP causing a glycine to glutamate substitution (p.Gly244Glu) in murine *ACP2* rendered the protein inactive while causing a variety of pathologies in mice, including growth retardation, ataxia-like phenotype, delayed hair appearance and lysosomal storage bodies in nucleated cells (Mannan *et al.* 2004). Even though *ACP2* belongs to a list of genes involved in response of human cells to multiple bacterial pathogens (Jenner & Young 2005), an association of *ACP2* polymorphisms with infection has not been previously described, and the effect of this novel identified non-synonymous SNP on *ACP2* function in pigs remains to be revealed.

Several other SNPs were associated with *Salmonella* burden in liver (*CCR1*) or both liver and spleen (*CD163*) in the IAH-Compton population (Fig. 7). *CCR1* encodes chemokine (C-C motif) receptor 1, which was sixfold upregulated in pigs inoculated with *S. Choleraesuis* at 48 h pi and twofold downregulated in pigs inoculated with *S. Typhimurium* at 8 h pi (Wang *et al.* 2007, 2008). *CCR1* is expressed on T cells, monocytes, neutrophils, eosinophils, basophils (Charo & Ransohoff 2006) and has chemoattractant as well as inflammatory modulating functions (Hartl *et al.* 2008; Khan *et al.* 2001). Polymorphisms in the *CCR1/CCR3/CCR2* region have been associated with coeliac disease in humans (Amundsen *et al.* 2010); this study is the first to demonstrate an association of *CCR1* with bacterial infection in pigs.

Macrophage scavenger receptor *CD163* is another gene associated with *Salmonella* infection phenotype, with pigs of A/A genotype at SNP #2 having about tenfold more bacteria in spleen and liver compared to C/C genotype animals (Fig. 7). Gene expression analysis revealed that *CD163* was induced sixteen-fold in *S. Choleraesuis*-inoculated pigs at 48 h pi (Wang *et al.* 2008) and about twofold in *S. Typhimurium*-inoculated pigs at 24 h pi (Uthe *et al.* 2007). *CD163* plays a homeostatic function by binding haemoglobin-haptoglobin complexes and protecting tissues from oxidative damage (Fabriek *et al.* 2005). It was found that *CD163* serves as a receptor for porcine reproductive and respiratory syndrome virus, which is needed for viral invasion (Calvert *et al.* 2007). In addition, *CD163* has been shown to bind gram-positive and gram-negative bacteria as well as respond to LPS inducing/regulating pro-inflammatory cytokine synthesis (Fabriek *et al.* 2009).

This research demonstrates a successful strategy for analysing genetic variation associated with the response of swine to *Salmonella*. Our unique approach for selecting candidate genes as well as initial pre-screening of putative SNPs resulted in twelve SNPs associated with *Salmonella* shedding or tissue colonization in pigs. This research is the first to link polymorphisms in the *GNG3*, *TAP1*, *NCF2*, *VCL*, *AMT*, *EMP1*, *ACP2*, *CCR1* and *CD163* genes with *Salmonella* infection traits, and we extended our investigations into the association of polymorphisms in *CCT7* with porcine resistance to *Salmonella*. We found that only one of these genes

had SNPs with association across populations (ACP2). However, because the populations had different phenotypes measured, it is unclear whether we should expect such across-population agreement. While these differences in *Salmonella*-related phenotypes as well as different genetic background of the populations may have provided more opportunities to find association, these characteristics may have reduced our ability to find SNPs with association across the populations. As additional *Salmonella*-challenged pig populations become available, validation of the association of these markers with *Salmonella* colonization and shedding in swine will be performed. In addition, further studies may reveal the effect of these SNPs on the function of the genes and their role in porcine disease resistance. The SNPs in our phenotype-associated genes can now be evaluated as markers for selecting animals that shed fewer bacteria and are less likely to cause pen-mate *Salmonella* contamination on-farm and in the slaughter plant. Thus, this research provides novel information for the pig industry regarding strategies for selecting pigs with reduced shedding and/or disease susceptibility.

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References

- Ammons M.C.B., Siemsen D.W., Nelson-Overton L.K., Quinn M.T. & Gauss K.A. (2007) Binding of pleomorphic adenoma gene-like 2 to the Tumor Necrosis Factor (TNF)- α -responsive region of the NCF2 promoter regulates p67phox expression and NADPH oxidase activity. *Journal of Biological Chemistry* **282**, 17941–52.
- Amundsen S.S., Rundberg J., Adamovic S., Gudjónsdóttir A.H., Ascher H., Ek J., Nilsson S., Lie B.A., Naluai A.T. & Sollid L.M. (2010) Four novel coeliac disease regions replicated in an association study of a Swedish-Norwegian family cohort. *Genes and Immunity* **11**, 79–86.
- APHIS info sheet. *Salmonella* on US swine sites – prevalence and antimicrobial susceptibility. 2009. http://www.aphis.usda.gov/vs/ceah/ncahs/nahms/swine/swine2006/Swine2006_salmonella_infosheet.pdf.
- Applegarth D.A. & Toone J.R. (2006) Glycine encephalopathy (nonketotic hyperglycinemia): comments and speculations. *American Journal of Medical Genetics. Part A* **140**, 186–8.
- Aquino-Galvez A., Camarena A., Montaña M. *et al.* (2008) Transporter associated with antigen processing (TAP) 1 gene polymorphisms in patients with hypersensitivity pneumonitis. *Experimental and Molecular Pathology* **84**, 173–7.
- Boyen F., Haesebrouck F., Maes D., Van Immerseel F., Ducatelle R. & Pasmans F. (2008) Non-typhoidal *Salmonella* infections in pigs: a closer look at epidemiology, pathogenesis and control. *Veterinary Microbiology* **130**, 1–19.
- Calvert J.G., Slade D.E., Shields S.L., Jolie R., Mannan R.M., Ankenbauer R.G. & Welch S.W. (2007) CD163 expression confers susceptibility to porcine reproductive and respiratory syndrome viruses. *Journal of Virology* **81**, 7371–9.
- Charo I.F. & Ransohoff R.M. (2006) The many roles of chemokines and chemokine receptors in inflammation. *The New England Journal of Medicine* **354**, 610–21.
- Chiang H., Swaggerty C.L., Kogut M.H., Dowd S.E., Li X., Pevzner I.Y. & Zhou H. (2008) Gene expression profiling in chicken heterophils with *Salmonella* enteritidis stimulation using a chicken 44 K Agilent microarray. *BMC Genomics* **9**, 526.
- Clapperton M., Diack A.B., Matika O., Glass E.J., Gladney C.D., Mellencamp M.A., Hoste A. & Bishop S.C. (2009) Traits associated with innate and adaptive immunity in pigs: heritability and associations with performance under different health status conditions. *Genetics, Selection, Evolution: GSE* **41**, 54.
- Crawley A.M., Mallard B. & Wilkie B.N. (2005) Genetic selection for high and low immune response in pigs: effects on immunoglobulin isotype expression. *Veterinary Immunology and Immunopathology* **108**, 71–6.
- Denagamage T.N., O'Connor A.M., Sargeant J.M., Rajić A. & McKean J.D. (2007) Efficacy of vaccination to reduce *Salmonella* prevalence in live and slaughtered swine: a systematic review of literature from 1979 to 2007. *Foodborne Pathogens and Disease* **4**, 539–49.
- van Diemen P.M., Kreukniet M.B., Galina L., Bumstead N. & Wallis T.S. (2002) Characterisation of a resource population of pigs screened for resistance to salmonellosis. *Veterinary Immunology and Immunopathology* **88**, 183–96.
- Dubeykovskiy A., McWhinney C. & Robishaw J.D. (2006) Runx-dependent regulation of G-protein gamma3 expression in T-cells. *Cellular Immunology* **240**, 86–95.
- Ebner P.D. & Mathew A.G. (2000) Effects of antibiotic regimens on the fecal shedding patterns of pigs infected with *Salmonella* Typhimurium. *Journal of Food Protection* **63**, 709–14.
- Edfors-Lilja I., Watrang E., Marklund L., Moller M., Andersson-Eklund L., Andersson L. & Fossum C. (1998) Mapping quantitative trait loci for immune capacity in the pig. *Journal of Immunology (Baltimore, Md.: 1950)* **161**, 829–35.
- Edfors-Lilja I., Watrang E., Andersson L. & Fossum C. (2000) Mapping quantitative trait loci for stress induced alterations in porcine leukocyte numbers and functions. *Animal Genetics* **31**, 186–93.
- Fabrick B.O., Dijkstra C.D. & van den Berg T.K. (2005) The macrophage scavenger receptor CD163. *Immunobiology* **210**, 153–60.
- Fabrick B.O., van Bruggen R., Deng D.M., Ligtenberg A.J.M., Nazmi K., Schornagel K., Vloet R.P.M., Dijkstra C.D. & van den Berg T.K. (2009) The macrophage scavenger receptor CD163 functions as an innate immune sensor for bacteria. *Blood* **113**, 887–92.
- Fernando R.L., Nettleton D., Southey B.R., Dekkers J.C.M., Rothchild M.F. & Soller M. (2004) Controlling the proportion of false positives in multiple dependent tests. *Genetics* **166**, 611–9.

- Finlay B.B. & Brumell J.H. (2000) *Salmonella* interactions with host cells: *in vitro* to *in vivo*. *Philosophical Transactions of the Royal Society of London. Series B, Biological Sciences* **355**, 623–31.
- Firth D. (1993) Bias reduction of maximum likelihood estimates. *Biometrika* **80**, 27–38.
- Foster S.L., Hargreaves D.C. & Medzhitov R. (2007) Gene-specific control of inflammation by TLR-induced chromatin modifications. *Nature* **447**, 972–8.
- Galina-Pantoja L., Mellencamp M.A., Bastiaansen J., Cabrera R., Solano-Aguilar G. & Lunney J.K. (2006) Relationship between immune cell phenotypes and pig growth in a commercial farm. *Animal Biotechnology* **17**, 81–98.
- Galina-Pantoja L., Siggins K., van Schriek M.G.M. & Heuven H.C.M. (2009) Mapping markers linked to porcine salmonellosis susceptibility. *Animal Genetics* **40**, 795–803.
- Gibson J.P. & Bishop S.C. (2005) Use of molecular markers to enhance resistance of livestock to disease: a global approach. *Revue Scientifique Et Technique (International Office of Epizootics)* **24**, 343–53.
- Guan T.Y. & Holley R.A. (2003) Pathogen survival in swine manure environments and transmission of human enteric illness – a review. *Journal of Environmental Quality* **32**, 383–92.
- Hartl D., Krauss-Etschmann S., Koller B. *et al.* (2008) Infiltrated neutrophils acquire novel chemokine receptor expression and chemokine responsiveness in chronic inflammatory lung diseases. *Journal of Immunology (Baltimore, Md.: 1950)* **181**, 8053–67.
- Heinze G. & Schemper M. (2002) A solution to the problem of separation in logistic regression. *Statistics in Medicine* **21**, 2409–19.
- Hurd H.S., McKean J.D., Wesley I.V. & Karkker L.A. (2001) The effect of lairage on *Salmonella* isolation from market swine. *Journal of Food Protection* **64**, 939–44.
- Hurd H.S., McKean J.D., Griffith R.W., Wesley I.V. & Rostagno M.H. (2002) *Salmonella enterica* infections in market swine with and without transport and holding. *Applied and Environmental Microbiology* **68**, 2376–81.
- Jain A., Tindell C.A., Laux I. *et al.* (2005) Epithelial membrane protein-1 is a biomarker of gefitinib resistance. *Proceedings of the National Academy of Sciences of the United States of America* **102**, 11858–63.
- Jenner R.G. & Young R.A. (2005) Insights into host responses against pathogens from transcriptional profiling. *Nature Reviews. Microbiology* **3**, 281–94.
- Jetten A.M. & Suter U. (2000) The peripheral myelin protein 22 and epithelial membrane protein family. *Progress in Nucleic Acid Research and Molecular Biology* **64**, 97–129.
- Kelly G.M., Saijoh Y., Finkielstein A. & Mangos S. (2008) Mouse G-protein gamma3 expression in the developing CNS and neural crest cell derivatives. *The International Journal of Developmental Biology* **52**, 1143–50.
- Khan I.A., Murphy P.M., Casciotti L., Schwartzman J.D., Collins J., Gao J.L. & Yeaman G.R. (2001) Mice lacking the chemokine receptor CCR1 show increased susceptibility to *Toxoplasma gondii* infection. *Journal of Immunology (Baltimore, Md.: 1950)* **166**, 1930–7.
- Kure S., Kato K., Dinopoulos A. *et al.* (2006) Comprehensive mutation analysis of GLDC, AMT, and GCSH in nonketotic hyperglycinemia. *Human Mutation* **27**, 343–52.
- Lu X., Gong Y.F., Liu J.F., Wang Z.P., Hu F., Qiu X.T., Luo Y.R. & Zhang Q. (2010) Mapping quantitative trait loci for cytokines in the pig. *Animal Genetic* **42**, 1–5.
- Mallard B.A., Wilkie B.N., Kennedy B.W. & Quinton M. (1992) Use of estimated breeding values in a selection index to breed yorkshire pigs for high and low immune and innate resistance factors. *Animal Biotechnology* **3**, 257–80.
- Mannan A.U., Roussa E., Kraus C., Rickmann M., Maenner J., Nayernia K., Krieglstein K., Reis A. & Engel W. (2004) Mutation in the gene encoding lysosomal acid phosphatase (*Acp2*) causes cerebellum and skin malformation in mouse. *Neurogenetics* **5**, 229–38.
- Meijerink E., Neuenschwander S., Fries R., Dinter A., Bertschinger H.U., Stranzinger G. & Vögeli P. (2000) A DNA polymorphism influencing alpha(1,2)fucosyltransferase activity of the pig FUT1 enzyme determines susceptibility of small intestinal epithelium to *Escherichia coli* F18 adhesion. *Immunogenetics* **52**, 129–36.
- Mielke P.W. & Berry K.J. (2007) *Permutation Methods: A Distance Function Approach*. Springer, New York.
- Mierke C.T. (2009) The role of vinculin in the regulation of the mechanical properties of cells. *Cell Biochemistry and Biophysics* **53**, 115–26.
- Miller G.Y., Liu X., McNamara P.E. & Barber D.A. (2005) Influence of *Salmonella* in pigs preharvest and during pork processing on human health costs and risks from pork. *Journal of Food Protection* **68**, 1788–98.
- Moss D.W., Raymond F.D. & Wile D.B. (1995) Clinical and biological aspects of acid phosphatase. *Critical Reviews in Clinical Laboratory Sciences* **32**, 431–67.
- Nollet N., Houf K., Dewulf J., De Kruif A., De Zutter L. & Maes D. (2005) *Salmonella* in sows: a longitudinal study in farrow-to-finish pig herds. *Veterinary Research* **36**, 645–56.
- O'Connor A.M., Denagamage T., Sargeant J.M., Rajić A. & McKean J. (2008) Feeding management practices and feed characteristics associated with *Salmonella* prevalence in live and slaughtered market-weight finisher swine: a systematic review and summation of evidence from 1950 to 2005. *Preventive Veterinary Medicine* **87**, 213–28.
- Perron G.G., Quessy S. & Bell G. (2008) A reservoir of drug-resistant pathogenic bacteria in asymptomatic hosts. *PLoS ONE*, **3**, e3749.
- Pesarin F. (2001) *Multivariate Permutation Tests: With Applications in Biostatistics*. Wiley, Chichester, West Sussex, England.
- Petry D.B., Lunney J., Boyd P., Kuhar D., Blankenship E. & Johnson R.K. (2007) Differential immunity in pigs with high and low responses to porcine reproductive and respiratory syndrome virus infection. *Journal of Animal Science* **85**, 2075–92.
- Reiner G., Hepp S., Hertrampf B., Kliemt D., Mackenstedt U., Dausgshies A. & Zahner H. (2007) Genetic resistance to *Sarcocystis miescheriana* in pigs following experimental infection. *Veterinary Parasitology* **145**, 2–10.
- Reiner G., Fischer R., Hepp S., Berge T., Köhler F. & Willems H. (2008) Quantitative trait loci for white blood cell numbers in swine. *Animal Genetics* **39**, 163–8.
- Reiner G., Willems H., Pesch S. & Ohlinger V.F. (2010) Variation in resistance to the porcine reproductive and respiratory syndrome virus (PRRSV) in Pietrain and Miniature pigs. *Journal of Animal Breeding and Genetics* **127**, 100–106.
- Rigney C.P., Salamone B.P., Anandaraman N., Rose B.E., Umholtz R.L., Ferris K.E., Parham D.R. & James W. (2004) *Salmonella*

- serotypes in selected classes of food animal carcasses and raw ground products, January 1998 through December 2000. *Journal of the American Veterinary Medical Association* **224**, 524–30.
- Rothschild M.F., Chen H.L., Christian L.L., Lie W.R., Venier L., Cooper M., Briggs C. & Warner C.M. (1984) Breed and swine lymphocyte antigen haplotype differences in agglutination titers following vaccination with *B. bronchiseptica*. *Journal of Animal Science*, **59**, 643–9.
- Saftig P., Hartmann D., Lüllmann-Rauch R., Wolff J., Evers M., Köster A., Hetman M., von Figura K. & Peters C. (1997) Mice deficient in lysosomal acid phosphatase develop lysosomal storage in the kidney and central nervous system. *The Journal of Biological Chemistry* **272**, 18628–35.
- Sancho-Shimizu V. & Malo D. (2006) Sequencing, expression, and functional analyses support the candidacy of *Ncf2* in susceptibility to *Salmonella* Typhimurium infection in wild-derived mice. *Journal of Immunology (Baltimore, Md.: 1950)* **176**, 6954–61.
- Schölz C. & Tampé R. (2009) The peptide-loading complex – antigen translocation and MHC class I loading. *Biological Chemistry* **390**, 783–94.
- Sellwood R. (1979) *Escherichia coli* diarrhoea in pigs with or without the K88 receptor. *The Veterinary Record* **105**, 228–30.
- Soundravally R. & Hoti S.L. (2008) Polymorphisms of the *TAP 1* and *2* gene may influence clinical outcome of primary dengue viral infection. *Scandinavian Journal of Immunology* **67**, 618–25.
- Storey J.D. & Tibshirani R. (2003) Statistical significance for genomewide studies. *Proceedings of the National Academy of Sciences of the United States of America* **100**, 9440–5.
- Uthe J.J., Royae A., Lunney J.K., Stabel T.J., Zhao S., Tuggle C.K. & Bearson S.M.D. (2007) Porcine differential gene expression in response to *Salmonella enterica* serovars Choleraesuis and Typhimurium. *Molecular Immunology* **44**, 2900–14.
- Uthe J.J., Wang Y., Qu L., Nettleton D., Tuggle C.K. & Bearson S.M.D. (2009) Correlating blood immune parameters and a CCT7 genetic variant with the shedding of *Salmonella enterica* serovar Typhimurium in swine. *Veterinary Microbiology* **135**, 384–8.
- Valpuesta J.M., Martín-Benito J., Gómez-Puertas P., Carrascosa J.L. & Willison K.R. (2002) Structure and function of a protein folding machine: the eukaryotic cytosolic chaperonin CCT. *FEBS Letters* **529**, 11–6.
- Wang H., Kong J., Ding F., Wang X., Wang M., Liu L., Wu M. & Liu Z. (2003) Analysis of gene expression profile induced by EMP-1 in esophageal cancer cells using cDNA Microarray. *World Journal of Gastroenterology: WJG* **9**, 392–8.
- Wang Y., Qu L., Uthe J.J., Bearson S.M.D., Kuhar D., Lunney J.K., Couture O.P., Nettleton D., Dekkers J.C.M. & Tuggle C.K. (2007) Global transcriptional response of porcine mesenteric lymph nodes to *Salmonella enterica* serovar Typhimurium. *Genomics* **90**, 72–84.
- Wang Y., Couture O.P., Qu L., Uthe J.J., Bearson S.M.D., Kuhar D., Lunney J.K., Nettleton D., Dekkers J.C.M. & Tuggle C.K. (2008) Analysis of porcine transcriptional response to *Salmonella enterica* serovar Choleraesuis suggests novel targets of NF κ B are activated in the mesenteric lymph node. *BMC Genomics* **9**, 437.
- Wang B., Wesley I.V., McKean J.D. & O'Connor A.M. (2010) Sub-Iliac Lymph Nodes at Slaughter Lack Ability to Predict *Salmonella enterica* Prevalence for Swine Farms. *Foodborne Pathogens and Disease* **7**, 795–800.
- Wen K., Rubenstein P.A. & DeMali K.A. (2009) Vinculin nucleates actin polymerization and modifies actin filament structure. *The Journal of Biological Chemistry* **284**, 30463–73.
- Wilkie B. & Mallard B. (1999) Selection for high immune response: an alternative approach to animal health maintenance? *Veterinary Immunology and Immunopathology* **72**, 231–5.
- Wimmers K., Murani E., Schellander K. & Ponsuksili S. (2009) QTL for traits related to humoral immune response estimated from data of a porcine F₂ resource population. *International Journal of Immunogenetics* **36**, 141–51.
- Ye S., Dhillion S., Ke X., Collins A.R. & Day I.N. (2001) An efficient procedure for genotyping single nucleotide polymorphisms. *Nucleic Acids Research* **29**, E88–88.
- Zhang S., Lillehoj H.S., Kim C.H., Keeler C.L., Babu U. & Zhang M.Z. (2008) Transcriptional response of chicken macrophages to *Salmonella enterica* serovar Enteritidis infection. *Developments in Biologicals* **132**, 141–51.
- Zhou H. & Lamont S.J. (2007) Global gene expression profile after *Salmonella enterica* Serovar Enteritidis challenge in two F8 advanced intercross chicken lines. *Cytogenetic and Genome Research* **117**, 131–8.

Supporting information

Additional supporting information may be found in the online version of this article.

Appendix S1 Explanation of MRBP and AULC methods of statistical analysis for the NADC population.

Table S1 Design of Sequenom assays.

Table S2 Gene lists for SNP analysis.

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