# 1 Title: Single-Cell Antigen Receptor Sequencing in Pigs with Influenza

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### 24 Abstract

25 Understanding the pulmonary adaptive immune system of pigs is important as respiratory 26 pathogens present a major challenge for swine producers and pigs are increasingly used to model 27 human pulmonary diseases. Single-cell RNA sequencing (scRNAseq) has accelerated the characterization of cellular phenotypes in the pig respiratory tract under both healthy and diseased 28 29 conditions. However, combining scRNAseq with recovery of paired T cell receptor (TCR) a and β chains as well as B cell receptor (BCR) heavy and light chains to interrogate their repertoires has 30 not to our knowledge been demonstrated for pigs. Here, we developed primers to enrich porcine 31 TCR  $\alpha$  and  $\beta$  chains along with BCR  $\kappa$  and  $\lambda$  light chains and IgM, IgA, and IgG heavy chains 32 33 that are compatible with the 10x Genomics VDJ sequencing protocol. Using these pig-specific assays, we sequenced the T and B cell receptors of cryopreserved lung cells from CD1D-34 expressing and -deficient pigs after one or two infections with influenza A virus (IAV) to examine 35 whether natural killer T (NKT) cells alter pulmonary TCR and BCR repertoire selection. We also 36 37 performed paired single-cell RNA and receptor sequencing of FACS-sorted T cells longitudinally sampled from the lungs of IAV-vaccinated and -infected pigs to track clonal expansion in response 38 to IAV exposure. All pigs presented highly diverse repertoires. Pigs re-exposed to influenza 39 antigens from either vaccination or infection exhibited higher numbers of expanded CD4 and CD8 40 41 T cell clonotypes with activated phenotypes, suggesting potential IAV reactive T cell populations. Our results demonstrate the utility of high throughput single-cell TCR and BCR sequencing in 42 pigs. 43

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#### 46 Introduction

High throughput single-cell RNA sequencing (scRNAseq) technology has greatly 47 48 increased our understanding of the phenotypic diversity and plasticity of immune cell types as well 49 as their cellular interactions in complex tissues in both healthy and disease states (1, 2). In addition to revealing cellular heterogeneity through RNA expression, scRNAseq can be coupled with 50 51 additional assays to enhance cellular phenotyping, such as enrichment of T cell receptor (TCR) and B cell receptor (BCR) repertoires using primers that target the C regions in mRNA transcripts 52 of TCR and BCR chains and isotypes. This allows construction of expressed TCRs and BCRs of 53 individual cells including genomic rearrangements between the variable (V), diversity (D), and 54 joining (J) regions of the TCR and BCR intervals responsible for creating diversity in receptor 55 binding surfaces. Pairing TCR/BCR sequencing with scRNAseq provides a powerful approach for 56 studying the relationship between immune repertoire and many types of immune responses. 57 Additionally, V(D)J recombination at the TCR and BCR loci can be used as endogenous barcodes 58 59 to trace T and B cell clonotypes as they expand or transition though different states, including within the same individual over time (3, 4). 60

Domestic pigs (*Sus scrofa*) are an important agricultural species that are intensively farmed making them vulnerable to many infectious pathogens. Therefore, a thorough understanding of the porcine immune system is needed to optimize vaccine and drug design and to identify immune targets for increased disease resistance through selective breeding and genetic engineering. Because of their many similarities to humans, swine are increasingly used in place of non-human primate models (5, 6). However, a limitation that prevents fully exploiting these pig models is our incomplete understanding of the porcine immune system which is due in part to a scarcity of

68 immune profiling reagents for pigs. scRNAseq which does not require marker-based sorting of cell
69 subsets is helping to address this gap.

70 In the current work, we developed porcine-specific TCR and BCR primers compatible with 71 the droplet-based protocols of the 10x Genomics Next GEM Single Cell 5' sequencing protocol. These assays were used to compare cryopreserved lung cells from pigs genetically engineered to 72 73 lack *CD1D*, which encodes an antigen presenting molecule required for the development of natural 74 killer T (NKT) cells, a subset of innate-like T cell that accumulates in barrier organs such as the 75 lungs (7-12). Pigs were analyzed after one or two infections with influenza A virus (IAV) to 76 interrogate the evolution of the TCR and BCR repertoires after primary or secondary infection and to determine if NKT cells exert T helper cell functions that influence receptor diversity. 77 Additionally, we applied our protocol to a longitudinal assessment of T cells recovered from the 78 lung lavage fluid of infant pigs exposed to IAV vaccination and infection. Here we were able to 79 track clonal expansion and monitor changes in the frequency of clonotypes within the same pig. 80 81 Together, these results demonstrate the potential of TCR/BCR profiling to better understand a wide variety T and B cell-related immune responses in pigs. 82

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#### 89 **Results**

#### 90 Single-cell RNA sequencing analysis of influenza virus-infected genetically edited pigs

Cryopreserved cells liberated from the enzyme digested lungs of mixed-breed pigs carrying 91 92 an inactive form of the CD1D (CD1D-/-) gene compared with littermates carrying one copy 93 (*CD1D-/+*) were subjected to paired scRNAseq and scTCR/BCRseq using our custom primer sets. One cohort of pigs was necropsied five days after a single infection (1X) with H1N1 94 95 A/Missouri/CS20N08/2020 (MO20) (Figure 1A and Table S1). To compare heterologous adaptive 96 immune responses, a second cohort of pigs was infected with H1N1 A/Missouri/CS20N08/2020 (MO20) virus two weeks after an initial infection with H1N1 A/California/04/2009 (pdmH1N1) 97 and necropsied 5 days later (2X). While 1X pigs presented an increase in body temperature and 98 shed more virus compared to 2X pigs, there was no difference in how the different genotypes 99 responded to infection (Figure S1). Single-cell sequencing was performed on 12 pigs (3 per group), 100 totaling 45,850 cells. A dimensionality reduction analysis identified 28 clusters by Uniform 101 Manifold Approximation and Projection (UMAP) that were annotated according to established 102 103 lineage markers (Figure 1B and Figure S2). The cell types most impacted by the number of times 104 pigs were infected were CD8<sup>+</sup> tissue resident memory T cells (TRM – cluster 4), cytotoxic CD8<sup>+</sup> 105 T cells (cluster 5), and cycling T cells (cluster 16) that were higher in 2X than 1X pigs, and CD2<sup>-</sup> 106  $\gamma\delta$  T cells (cluster 9), and a subset of natural killer cells (NK2) cells (cluster 11) that were higher 107 in 1X than 2X pigs (Figure 1C). The proportions of most cell types were comparable between genotypes with the exception that 2X CD1D-/- pigs had more CD4<sup>+</sup> TRM cells (cluster 3) and 108 109 fewer cytotoxic CD8<sup>+</sup> T cells (cluster 5) after two infections compared to 2X CD1D-/+ pigs. Next, 110 we compared differentially expressed genes within individual cell types between 1X and 2X pigs by genotype (Figure 1D) or between CD1D-/+ and CD1D-/- pigs by number of infections (Figure 111

1E). We found similar numbers of differentially expressed genes between CD1D-/- and CD1D-/+ 112 pigs and between 1X and 2X pigs. However, a cluster of monocytes and macrophages (cluster 17) 113 114 from 2X CD1D-/+ pigs had more upregulated genes than 2X CD1D-/- pigs. An ingenuity pathway analysis of canonical cellular immune response networks identified that several of these 115 upregulated genes fell within "Interferon Signaling" (IF135, IF16, IF171, IFNAR2, ISG15, MX1, 116 117 PSMB8, STAT1, TAP1) and "Antigen Presentation Pathway" (CD74, HLA-DRA, PDIA3, PSMB8, *PSMB9*, *TAP1*) pathways, suggesting that stimuli originating from NKT cells may have altered the 118 119 maturation of these antigen presenting cells.

TCR repertoire of lung T lymphocytes

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We analyzed the pig lung tissue cells using our pig-specific V(D)J primers designed for 121 122 compatibility with the 10x Genomics Chromium Next GEM Single-cell 5' kit (Table S2). Over the 12 samples, we obtained 927,503,456 sequence reads an average of 77,291,955 reads per library, 123 Data file 1). A de novo assembly of raw sequencing reads produced unannotated porcine V(D)J 124 contigs which were identified using the sequencing primers and thereafter aligned to cells in the 125 126 gene expression clusters in Figure 1. Across all samples, approximately 60% and 70% of identified 127 TRA or TRB contigs were respectively aligned to single cells (Figure 2A, Data file 1). Assembled 128 VDJ sequences were blasted against the international ImMunoGeneTics (IMGT) germline TRBV, 129 TRBD, TRBJ, and TRAJ databases (13). Approximately 70% of TRB contigs in a pairing with 130 TRA contigs mapped to an annotated TRVB or TRJB gene (Data file 1). Because V $\alpha$  genes are 131 not annotated in IMGT, V $\alpha$  sequences were assigned according to pig TRAV sequences from our previous publication (14) (Figure S3, Data file 1). Only cells with IMGT-annotated TRB genes 132 133 that were paired with productive TRA were used for further analysis (Figure 2B). These cells

134 accounted for between 23% and 38% of cells within  $\alpha\beta$  T cell clusters (clusters 1-6) across 135 samples.

The expression of V $\beta$ /J $\beta$  and V $\alpha$ /J $\alpha$  combinations was analyzed to determine if favored 136 137 rearrangements were correlated with CD1D genotype or the number of IAV infections (Figure 2C and Figure S3). Overall, TRBJ3-3\*01, TRBJ1-2\*01, and TRBJ1-1\*01 were used in many 138 139 rearrangements, while pairings with TRBJ1-5\*01, TRBJ2-5\*01, TRBJ3-7\*01, TRBJ1-6\*01, and TRBJ2-1\*01 were relatively rare (Figure 2C). This is similar to our previous analysis of pig 140 141 peripheral blood T cells that used a bulk RNA sequencing approach (14). We observed that 2X 142 *CD1D*-/+ pigs had V $\beta$ /J $\beta$  recombinations that were more similar to each other than to other pigs 143 (Figure 2D). This was also the case for pigs s303, s305, s307, and s308, which were from the same litter. Since structurally rearranged TCRs are selected by major histocompatibility complex (MHC) 144 145 molecules, we analyzed swine leukocyte antigen (SLA) class I and II expression in individual pigs 146 by aligning scRNAseq transcripts across clusters (Figure S4) to the IPD-MHC database that provides a repository of MHC sequences for a number of species, including swine (13). To 147 visualize SLA usage, a row-scaled mean expression of the 10 highest class I (Figure 2E) and class 148 II (Figure 2F) genes in each pig was performed. Taking the expression of both SLA classes 149 together, we could group pigs into 6 distinct MHC haplotype inheritance patterns (designated A-150 151 F) as follows: A – s403, s406, s408; B – s303, s307, s308, s407, s412; C – s305; D – s402; E – s411; F – s404. V $\beta$ /J $\beta$  pairings in the five B inheritance pattern pigs clustered together (Figure 152 153 2D), suggesting a link between MHC inheritance and VDJ selection.

154 Next, since TRB gene segments are fully annotated in IMGT whereas TRAV segments are 155 not, we used identical CDR3 $\beta$  region sequences to analyze our samples for expanded clonotypes 156 (Data file 1). Some clones were found in more than one pig, with the highest numbers of shared

clones among the 2X infected pigs (Figure 2G). Additionally, 2X pigs, especially the CD1D-/+ 157 158 group, had more expanded clones than the 1X groups (Figure 2H). The highest concentrations of 159 clonally expanded T cells were among CD4<sup>+</sup> and CD8<sup>+</sup> TRMs, cytotoxic CD8<sup>+</sup> T cells, and cycling 160 T cells while comparatively few expanded clones were present among peripheral-derived T cells 161 in clusters 1 and 2 (Figure 2I). Expanded clones were enriched for immune activation/effector 162 related genes compared to unexpanded clones (Figure 2J). 2X CD1D-/+ pigs contributed four of the five most expanded clonotypes, all of which included more than twelve cells (Figure 2K and 163 2L). One of these clonotypes originated from CD4<sup>+</sup> TRMs while the remaining four were from 164 CD8<sup>+</sup> TRMs (Figure 2M). 165

#### 166 BCR repertoire of lung B lymphocytes

Using a similar approach to our TCR profiling, we analyzed the pig lung tissue cells using 167 168 our pig-specific primers for the IGK, IGL, IGHM, IGHA, and IGHG genes (Table S2), which 169 respectively encode the immunoglobulin  $\kappa$  and  $\lambda$  light chains and IgM, IgA, and IgG heavy chains. 170 Over the 12 samples, we obtained 1,395,728,419 sequence reads an average of 11,631,0701 reads 171 per library (Figure 3A, Data file 1). Assembled V(D)J sequences were blasted against the IMGT germline IGL, IGK, and IGH databases (13). Only cells with IMGT-annotated IGH genes that were 172 paired with productive IGL or IGK chains were used for further analysis. The percentage of B cells 173 174 expressing different light and heavy chain contigs are as follows, 21% IGK, 40% IGL, 52% IGHM, 5% IGHG, and 3% IGHA. These cells accounted for between 53% and 70% of B cells among the 175 176 12 samples.

The overall IGL to IGK ratio was 1.8 (Figure 3B). Prior studies have reported that IGL:IGK
usage in circulating immature pig B cells is ~1:1(15-17). Plasma B cells (cluster 15) had the highest
proportions of IGHG+ and IGHA+ cells consistent with B cells that have undergone diversification

for mucosal antibody secretion (Figure 3C). Since our IGHG primers targeted a conserved constant region of the eight genomic IgG constant region gene sequences cataloged in IMGT (*IGHG1*, *IGHG2*, *IGHG3*, *IGHG4*, *IGHG5-1*, *IGHG5-2*, *IGHG6-1*, *IGHG6-2*) (18-20), we mapped IGHG sequences to the IMGT database. *IGHG1* dominated all three clusters (Figure 3D). *IGHG5-2* was also detected in every B cell subset. However, only antigen-experienced memory B cells and plasma cells in clusters 14 and 15 exhibited *IGHG2*, *IGHG3*, and *IGHG5-1* subclasses. *IGHG4* and *IGHG6* could not be distinguished from the other subclasses.

Next, we analyzed V(D)J gene segment usage (Figure 3E, Figure S5 and Figure S6). Unlike
humans or laboratory rodents, pigs use a limited number of IGHV, IGHD, and IGHJ genes to form
most of their BCR repertoire, with >90% of the VDJ repertoire made up of seven IGHV genes,
two IGHD segments, and a single IGHJ segment (21-23). Consistent with these studies, we found
six IGHV genes (*IGHV1-15, IGHV1S2, IGHV1-4, IGHV1-8, IGHV1S5, IGHV1-6*) accounted for
~70% of IGHV usage (Figure 3E and Figure S6) and that IGHD and IGHJ usage was largely
restricted to *IGHD1* or *IGHD2* and *IGHJ5*.

We analyzed our samples for expanded clonotypes defined by the recombination of 194 195 identical IG light and heavy chain CDR3 sequences (Data file 1). This revealed far fewer expanded 196 B cells compared to the T cell compartment, with no single clonotype containing more than four 197 cells. Almost all expanded clonotypes were among the small number of IgG or IgA secreting 198 plasma cells (cluster 15) (Figure 3F and 3G). No striking differences in IGH usage (Figure 3H) and clonotype expansion (Figure 3I) were observed among the four treatment groups. However, 199 200 the ratio of *IGHG5-2/IGHG1* was greater in 2X than 1X pigs (Figure 3J) while heavy chain CDR3 201 length tended to be greater in 1X than 2X pigs (Figure 3K).

### 202 Longitudinal assessment of T cells from lung lavage fluid

Clonotype tracking is a powerful approach to monitor changes in the frequency of 203 clonotypes of interest in cancer and vaccine immunology within a single individual (24-28). Using 204 our swine TCR  $\alpha$  and  $\beta$  chain primers, we analyzed T cells for V(D)J clonotypes and TCR  $\alpha$  and 205  $\beta$  chain gene usage from the lungs of three specific pathogen free raised piglets (Figure 4A). Two 206 207 pigs (FLU1 and FLU2) were vaccinated with a combination of inactivated pdmH1N virus and adjuvant at 28 days of age and boosted 15 days later. Both pigs were infected with live pdmH1N 208 virus 2 weeks after the booster. Lung fluid was collected 3 days before infection (T1) and 7 days 209 after infection (T2). The third pig (NAIVE) was lavaged at 28 (T1) and 33 (T2) days of age. 210 211 Between 1,041 and 6,789 (average = 3,472) CD3<sup>+</sup> cells sorted from each lung fluid sample (Figure 4B) were subjected to paired single-cell RNA and TCR sequencing. The combined dataset 212 213 separated into 15 clusters (Figure 4C and 4D). Clusters 10 and 11 were  $\gamma\delta$  T cells that are relatively abundant in pigs. Clusters 1, 2, 3, 4, 5, 6, 7, 11, 12, 13, 14 presented tissue residency markers, 214 while clusters 8, 9, and 10 expressed circulating T cell markers (Figure 4E). Tissue resident 215 216 memory T cells were composed of both CD4<sup>+</sup> (cluster 1) and CD8<sup>+</sup> cells (clusters 2, 4, 5, 6, 12) as well as proliferating cells that contained a mixture of CD4<sup>+</sup> and CD8<sup>+</sup> TRMs (cluster 13, 14). In 217 response to IAV infection, both FLU1 and FLU2 pigs presented an increase in the frequency of 218 219 proliferating CD4<sup>+</sup> and CD8<sup>+</sup> TRMs, CD2<sup>-</sup> γδ T cells, CD4<sup>+</sup> TRMs, peripheral CD4<sup>+</sup> T cells, naïve CD8 $\alpha\alpha$  T cells, and CD8<sup>+</sup> tissue effector memory (TEM) clusters, and a decrease in the frequency 220 of CD8<sup>+</sup> TRMs (Figure 4F). We identified 10 modules of co-regulated genes and regulatory 221 networks across cell types (Figures 4G and 4H, Data file 1) among which Module 5 in clusters 7, 222 8, 9, 10 harbored naïve/circulating T cell genes, Module 6 in clusters 2, 3, 4, 5, 6, 11 harbored 223 tissue residency and cytotoxic genes, and Module 10 in clusters 1, 2, 11 harbored interferon 224 225 stimulated genes (ISG).

Approximately 60% of  $\alpha\beta$  T cells recovered had paired TCR $\alpha$  and TCR $\beta$  chains (Figure 226 5A). Sequence identity can be used to map the phylogenetic relatedness of TCR $\alpha$  and TCR $\beta$  chains 227 228 in individual samples (Figure 5B). Many clones, identified by CDR3ß sequences, were present at both T1 and T2 in the same animal, especially the FLU2 pig (Figure 5C). A high proportion of 229 230 expanded clones were CD8<sup>+</sup> TRMs (Figure 5D). The two vaccinated and infected pigs presented the five most expanded clones, especially the FLU2 pig (Figure 5E and 5F). The low number of 231 expanded clonotypes present in the NAÏVE pig samples is due partly to the lower number of cells 232 233 we were able to collect from this pig. Next, we examined a larger collection of expanded 234 clonotypes in FLU1 and FLU2 pigs, before and after infection, to identify potential influenzareactive T cells (Figure 5G). While the frequency of several clones decreased from T1 to T2, some 235 increased, including CSAGERSNYEQIF, CASSVRSYPLNDLHF, CASSFGGVHTGQLYF, 236 CAWSTTGTVTGQLYF, and CSAGEGGFGDTCFF. We also analyzed specificity groups within 237 238 the CDR3 $\beta$  repertoire using immunarch (29, 30), a program that enables clustering of TCRs with 239 an increased probability of sharing antigen specificity due to conserved motifs of CDR3 sequences. Two CDR3β 4-mer motif patterns (ASSL and SSLV) were found to be enriched in FLU1 and FLU2 240 pig samples (Figure 5H). Interestingly, a few of the CDR3ß sequences in expanded clones were 241 242 identical or differed by a single amino acid from curated human TCR CDR3ß sequences which 243 recognize IAV epitopes in M1, NP, PB1, and PB2 (31). For example, the seventh most expanded 244 CDR3ß sequences in all pigs, ASSPGQGYEQ, matches a human CDR3ß sequence that recognizes the immunodominant IAV Matrix protein 1 epitope GILGFVFTL when presented by human HLA-245 A\*0201 (Figure 5I) (32, 33). This may arise because peptide binding motifs of some common 246 swine SLA molecules partly overlap with the binding motifs of human HLA molecules, including 247 248 a number of HLA-A\*0201-restricted IAV peptides (34).

#### 249 Discussion

The current study describes assays for single-cell TCR/BCR sequencing in pigs which 250 251 presents a useful tool for enhancing effective vaccine and therapeutic design to protect swine health and to increase the potential of pigs as biomedical models for studying human immune-related 252 physiological processes and diseases. We examined the utility of the assay in the setting of the 253 254 pulmonary immune response against IAV infection since influenza is a respiratory pathogen of major importance for both humans and swine (35). One set of samples were from cryopreserved 255 lung sections of *CD1D*-expressing and -deficient pigs after one IAV infection or two infections 256 with heterologous IAVs. This is of interest since NKT cell effector responses are important for 257 anti-IAV immunity in mice, including that NKT cell-deficient mouse strains are significantly more 258 susceptible to IAV infections than standard mice (36-39). Moreover, NKT cells are capable of a 259 wide array of CD4 T helper cell functions, which have the capacity to elicit wide-ranging cellular 260 and humoral responses that can substantially boost the quality and durability of immune responses, 261 262 including against heterologous and heterosubtypic IAV infections (40). Among the 12 samples in 263 this dataset, we detected almost all VDJ gene segments annotated for TCR  $\beta$  chains, including some that were annotated as pseudogenes. In addition, most of the V $\alpha$  genes detected overlapped 264 with TCR  $\alpha$  chains that we identified in a previous analysis of TCR chain usage using bulk 265 RNAseq (14). 266

267 While we found that cells which expressed both  $\alpha$  and  $\beta$  TCR chains were mostly within 268  $\alpha\beta$  T cell clusters (clusters 1, 2, 3, 4, 5), we also detected cells expressing unpaired  $\alpha$  and  $\beta$  chains 269 in some non- $\alpha\beta$  T cell clusters, such as CD2<sup>-</sup>  $\gamma\delta$  T cells that expressed TCR  $\beta$  chains and NK cells 270 and B cells that expressed TCR  $\alpha$  chains. This is consistent with prior reports that a significant 271 proportion of peripheral  $\gamma\delta$  T cells express TCR  $\beta$  (41) chains and that NK cells express germline TCR transcripts (42). The NK cell observation is supported by the fact that virtually all NK cell TRA transcripts matched to TRAJ segments but very few to TRAV segments. Examination of V $\beta$ /J $\beta$  combinations confirmed previous studies showing that certain rearrangements are favored in pigs (14, 43). In several pigs, VDJ rearrangements clustered by MHC inheritance pattern. We also found that VDJ rearrangements preferred by 2X *CD1D-/+* pig clonotypes clustered together which could mean that IAV infection influenced V $\beta$ /J $\beta$  selection in NKT cell-intact pigs.

The most expanded clones were among  $CD4^+$  and  $CD8^+$  TRMs, cytotoxic  $CD8^+$  T cells, and proliferating T cells, consistent with reports that these populations harbor antigen experienced T cells that are poised for rapid responses during an IAV infection (44). As expected, 2X pigs had more expanded clones than 1X pigs. This was less apparent in *CD1D-/-* compared to *CD1D-/+* pigs, which might suggest that induction of IAV-specific lung T cells is reduced in the absence of NKT cell helper functions.

Lung tissue B cells consisted of naïve B cells, memory B cells, and a small population of 284 plasma cells. Plasma cells displayed the highest diversity in immunoglobulin heavy chain usage 285 and clonally expanded B cells. Consistent with prior reports (15-18, 20, 21, 23, 45, 46), we found 286 (i) a mixture of IGL+ and IGK+ B cells, (ii) IgG heavy chain usage was dominated by the IGHG1 287 subclass, and (iii) a limited number of IGHV, IGHD, and IGHJ genes formed most of the BCR 288 repertoire. Pigs are interesting in so far as their pathway of antibody repertoire development has 289 evolved somewhat differently from mice and humans, including that they possess a highly 290 291 streamlined IGH gene complex, which contains IGHV genes that all belong to a single ancestral 292 IGHV3 family, and that only one IGHJ segment is functional (18, 20, 21, 23, 45). Because of the small number of IGHV, IGHD, and IGHJ segments used, the combinatorial diversity in pigs is 293 294 comprised of a mere  $\sim 14$  possibilities compared to  $\sim 9,000$  in humans (23).

TCR transcript capture was more efficient in longitudinally collected lavage fluid T cell 295 296 samples than in the *CD1D* lung tissue samples, probably owing to the former consisting entirely 297 of FACS-purified T cells. As in lung tissue cells, most  $\alpha\beta$  T cell clusters exhibited paired  $\alpha$  and  $\beta$ TCR chains whereas a significant fraction of CD2<sup>-</sup>  $\gamma\delta$  T cells expressed TCR  $\beta$  chains and CD2<sup>+</sup> 298 299  $\gamma\delta$  T cells and CD8 $\alpha\alpha$  T cells were enriched for TCR  $\alpha$  chains. Clusters with the highest numbers 300 of expanded clones were again tissue resident memory T cell populations. Our ability to detect a substantial number of the same T cell clones at two different timepoints in the same individual 301 302 shows the utility of TCR profiling for monitoring changes in clonotypes of interest in pigs. The 303 higher number of expanded clonotypes within FLU1 and FLU2 pig samples, some of which overlapped, compared to the NAÏVE pig, may be the result of IAV exposure by vaccination and 304 infection leading to an increase in antigen experienced T cells in lung tissue and/or because fewer 305 cells were collected in the NAÏVE pig. While there is a lack of reagents to identify influenza-306 307 specific T cell clones in commercial pig breeds, this information can to some extent be inferred by 308 studying clonotypes in vaccinated pigs that increase after virus exposure. Using this approach, we 309 identified CDR3 sequences that are potentially reactive to IAV antigens, including a clone with a CDR3 $\beta$  sequence identical to a human motif that recognizes an immunodominant epitope from 310 Matrix protein 1 (34). 311

In summary, the assays presented in this study can easily be applied to 5' 10x Genomics protocols for use in swine. Our protocols can be employed to profile TCRs and BCRs in the same sample which enhances the utility of the method as most adaptive immune responses involve both cellular and humoral responses. Accordingly, the combined protocol could shed light on acquired immunity that develops in response to vaccination and infection in production pigs, as well as in the growing number of immune-related pig models being developed for biomedical use.

#### 318 Methods

#### 319 Pigs

The National Swine Resource and Research Center (NSRRC) at the University of Missouri 320 bred a boar homozygous for a CD1D gene deletion with two sows heterozygous for the CD1D 321 322 deletion that were full sisters to produce piglets that were homozygous a the CD1D deletion (CD1D-/-) as well as heterozygous segregants (CD1D-/+). Our previously described CD1D 323 breeding herd (47) is on a commercial Large White crossbred background and maintained under 324 325 specific pathogen free conditions. The CD1D genotypes of pigs were determined by PCR and flow 326 cytometry as previously described (47, 48). Piglets used for longitudinal assessment of T cells 327 from lung lavage fluid were commercial Large White crossbred background pigs provided by the NSRRC. 328

#### 329 Virus infection and sample collection

330 Eight CD1D-/- and eight CD1D-/+ pigs were transferred to biocontainment rooms at 4 weeks of age after being confirmed seronegative for IAV nucleoprotein antibodies by ELISA 331 developed by at the Veterinary Diagnostic Laboratory at the Iowa State University. At day 0, 4 332 CD1D-/- and 3 CD1D-/+ pigs were intratracheally infected with  $1 \times 10^6$  tissue culture infectious 333 dose (TCID<sub>50</sub>) of H1N1 A/California/04/2009 (pdmH1N1) in 2mL of DMEM (Gibco, Brooklyn, 334 NY) after sedation with a combination of midazolam, butorphanol, and xylazine. Fourteen days 335 sedated and infected with 1x10<sup>6</sup> TCID<sub>50</sub> of H1N1 336 later. all 16 pigs were A/Missouri/CS20N08/2020 (MO20) IAV. Pigs were measured for clinical disease signs and daily 337 338 nasal swab virus titers as previously described (49). Five days later, all pigs were sedated and euthanized by pentobarbital sodium intracardiac injections (70 mg/kg of body weight). At 339

necropsy, the lungs were removed from the thoracic cavity for tissue collection. and euthanized.
Cells were isolated from 3 animals of each genotype from single (1X) and twice (2X) infected pigs
for scRNAseq and receptor profiling. Litter, sex, *CD1D* genotype, and MHC inheritance pattern
of the piglets used for sequencing are described in (Table S1).

For the study to collect T cells through successive lung lavages, two pigs (FLU1 and FLU2) 344 345 were intramuscularly vaccinated with a combination of 1x10<sup>6</sup> TCID<sub>50</sub> of ultraviolet-inactivated 346 pdmH1N1 virus and an oil-in water adjuvant (Emulsigen, 1:5 vaccine volume) at 28 days of age 347 and boosted 15 days later. Both pigs were intratracheally infected with 1x10<sup>6</sup> TCID<sub>50</sub> live pdmH1N1 virus 2 weeks after the booster. Lung fluid was collected 3 days before and 7 days after 348 infection. A third unvaccinated, uninfected pig (NAÏVE) was lavaged at 28 and 33 days of age. 349 Pigs were intratracheally sedated with midazolam, butorphanol, and xylazine to perform lung 350 lavages and infections. Lavages involved inserting a size 10 French catheter attached to a syringe 351 into the lung after which the lung was flushed twice with 5 ml of sterile saline solution. Recovered 352 353 lung fluid was ejected into 10 ml phosphate buffered solution containing 10% fetal bovine serum (FBS). 354

The studies were in accordance with the University of Missouri's Institutional Animal Care and Use Committee (protocol number 34343) and Institutional Biosafety Committee (protocol number 17320).

#### 358 Tissue sampling and cell isolation

Approximately 1 g of tissue collected from the left cranial, middle, and caudal lung lobes, were combined, and then digested with 2.5 mg/mL of Liberase TL (Roche, Indianapolis, IN) in Dulbecco's Modified Eagle Medium (Thermo Fisher, Waltham, MA) at 37°C for 45 minutes. The digested tissue was dispersed into single cells as previously described (50), and then passed

through a 70 µm cell strainer (Thermo Fisher, Waltham, MA). Cells were immediately 363 364 cryopreserved in freezing media [90% FBS, 10% dimethylsulfoxide (DMSO)] in temperaturecontrolled freezing containers at 3 x 10<sup>7</sup> cells per/mL and stored at -80°C until use. Samples were 365 366 thawed in thawing media (RPMI-HyClone, Logan, UT, - 20% FBS), resuspended in RPMI with 367 10% FBS, filtered through a 40µm filter (Bel-Art SP Scienceware, Wayne, NJ), and counted for 368 viable cells using a Countess 3 automated cell counter (Thermo Fisher, Waltham, MA). To obtain 369 T cells from lung washes, lavage fluid was filtered first through a 70 µm cell strainer (Thermo 370 Fisher, Waltham, MA) and then a 40 µm pipette tip Flowmi<sup>®</sup> cell strainer (SP Scienceware, Warminster, PA), washed in RPMI with 10 % FBS, counted, stained with PE-Cy7-conjugated anti-371 porcine CD3 antibody (clone BB23-8E6-8C8; BD Biosciences, San Jose, CA) and propidium 372 iodide viability dye, and sorted for live CD3 positive cells using a BD FACSMelody Cell Sorter 373 (BD Biosciences, San Jose, CA). Approximately 10,000 cells from cryopreserved lung tissue and 374 375 between 1,041 and 6,789 T cells from lung lavage fluid were loaded onto the 10x Chromium 376 controller (10x Genomics, Pleasanton, CA).

### 377 Primer design

Pig-specific V(D)J primers were designed according to guidelines from the 10x Genomics 378 Chromium Next GEM Single-cell 5' V2 user guide, which is well described in a recent publication 379 380 on scTCRseq in dogs(51). This protocol employs a nested PCR design which involves two rounds of V(D)J amplification using the same forward primer that primes off the 5' Illumina adapter 381 sequence which is annealed to the 10x barcoded cDNA during the conversion from mRNA. The 382 first round of amplification uses the 5' forward primer in combination with a 3' outer reverse 383 primer that matches the C region of the targeted chain. The second round uses the same forward 384 385 primer in combination with a second reverse primer that primes the C region at an inner 5' region from the outer reverse primer. To design the 3' reverse primer sets, C-gene sequences were identified for TRA, TRB, IGH, and IGL and IGK transcripts. Inner and outer primers were respectively designed to target regions between 50-200 and 200-300 base pairs away from the 5' region of the C region. Primer candidates were selected based on the percent of GC content, similar melting temperature range, and minimal predicted interaction with other regions in the pig genome. The final primer sequences as well as accession numbers for the DNA and rearranged mRNA transcripts used to identify the C regions are listed in (Table S2).

# 393 Single cell processing

Libraries were constructed by following the manufacturer's protocol with reagents 394 supplied in the Chromium Next GEM Single Cell 5' Kit v2 (10x Genomics). Briefly, cell 395 suspension concentration and viability were measured with a Cellometer K2 (Nexcelom 396 Biosciences, Lawrence, MA) stained with an acridine orange/propidium iodine dye mix 397 (Invitrogen, Waltham, MA). Cell suspension combined with reverse transcription master mix were 398 loaded on a Chromium Next GEM chip K along with gel beads and partitioning oil to generate gel 399 400 emulsions (GEMs). GEMs were transferred to a PCR strip tube and reverse transcription 401 performed on a Veriti thermal cycler (Applied Biosystems, Waltham, MA) at 53°C for 45 minutes. All samples underwent 11 cycles of cDNA amplification upon which cDNA concentration and 402 quality were assessed using a Fragment Analyzer 5200 (Agilent, Santa Clara, CA). For the gene 403 404 expression library, up to 50 ng of the cDNA was fragmentated, end-repaired, A-tail added, and 405 ligation of sequencing adaptors was performed according to manufacturer specifications. V(D)J 406 libraries were constructed using pig-specific primers for two successive enrichments of TCR and 407 BCR transcripts. The TCR and BCR assay used primer pools containing 1.43 µM per gene specific primer and 1.43 µM of the 10x forward primer. Nested PCR amplification of the TCR and BCR 408

sequences was performed using adapted mouse and human PCR protocols. This involved 409 410 amplifying 2 µL of cDNA in 100 µL total reaction volume using 50 ul Amp Mix (10x Genomics). 411 Steps involved in the first reaction were 98 °C for 45 s for initial denaturation followed by 9 cycles of 98 °C for 20 s, 65 °C for 30 s, and 72 °C for 60 s. PCR product was purified using AxyPrep 412 MagPCR Clean-up beads (Axygen) and subjected to a second round of amplification using the 413 414 same cycling conditions to the first except a total of 8 cycles was used. The amplicons were purified using AxyPrep MagPCR Clean-up beads (Axygen). Libraries were constructed from PCR 415 416 amplicons according to manufacturer specifications. The concentrations for all libraries were 417 measured with the Qubit HS DNA kit (Invitrogen) and fragment sizes were determined on a 418 Fragment Analyzer 5200 (Agilent). Libraries were pooled and sequenced on a NovaSeq 6000 (Illumina, San Diego, CA) to obtain paired end reads. The minimum sequencing depths targeted 419 were 40,000 reads per cell for 5' GEX libraries and 10,000 reads per cell for V(D)J libraries. 420

421

#### 1 Single-cell RNA sequencing data analysis

The Sscrofa 11.1 genome assembly was used to align sequencing reads to generate gene 422 423 matrix data by Cell Ranger (v8.0.0). Clustering analyses were performed using Seurat 424 (v.4.4.0)(52). To filter out low-quality genes and cells, only genes expressed in more than 3 cells and cells with more than 200 genes and less than 10% mitochondrial reads were included in the 425 426 analysis. Afterward, we followed a standard integration workflow to integrate samples. Briefly, 427 transcript counts were log normalized, and the top 2,000 most variable genes in each dataset were identified using the *FindVariableFeatures* function. Then, the *SelectIntegrationFeatures* function 428 429 was applied to genes that were consistently variable across datasets. Next, the 430 FindIntegrationAnchors function identified a set of anchors between datasets using the top 30 dimensions from the canonical correlation analysis to specify the neighbor search space. Next, an 431

integrated dataset was created by running the *IntegrateData* function. Then, clustering analysis
workflow was performed using *RunPCA*, *FindNeighbours*, *FindClusters*, and *RunUMAP*. Cell
types were assigned based on the expression of known cell type markers (Figure S2).

435

# Single-cell V(D)J data analysis

436 Single-cell TCR sequencing reads were assembled into contigs using cellranger vdj (10x Genomics) pipeline in denovo mode rather than reference-based mode due to the incomplete 437 annotation of the pig germline V $\alpha$  chain sequences. To identify the V(D)J chains, we searched 438 439 assembled contigs against inner-enrichment primers using the usearch global command. Primer 440 matched TCR αβ and BCR IGH and IGL and IGK chains were selected and integrated with the 441 above cellular gene expression profiles. The TCR  $\beta$  chains with matched TCR  $\alpha$  chains were selected for downstream analysis. TRBV, TRBD, TRBJ, and CDR3 sequences were mapped to the 442 pig TRB reference in IMGT using the IMGT/V-QUEST sequence alignment software. Cells with 443 duplicated or multiple contigs were removed. Immunarch (v1.0.0) (29) was used to track clones 444 across samples and identify k-mers from CDR3 sequencing. Scirpy (v.0.12.0) was used to analyze 445 446 TCR  $\beta$  repertoires for clonal expansion (each unique CDR3) using the scirpy.pl.clonal expansion 447 command (53). In addition, CDR3 sequences were searched within the Immune Epitope Database (IEDB) (31) to find matches predicted to recognize epitope specificity using TCRMatch T cell 448 epitope prediction tool. The unique contigs of TCR  $\alpha$  and  $\beta$  chains in each cell were aligned to 449 450 each other using CLUSTALW (https://www.genome.jp/tools-bin/clustalw), after which phylogenetic trees were generated to infer the similarities among contigs using the package ape 451 452 (v5.7-1)(54). Using MMseqs2 (55), TRAJ sequences were mapped to the pig TRAJ reference in 453 IMGT while TRAV segments were annotated according to TRAV sequences deposited in in GeneBank (55) that we previously named according to similar human TRAV genes (14). Similarly, 454

BCR repertoires were annotated using the available pig IGH and IGK/IGL reference in IMGT
using IMGT/V-QUEST(56). The reference mapped IGH chains and IGK/L chains were selected
for downstream analysis. The IGH constant segments were mapped to IMGT/GENE-DB database.
Scirpy was used to analyze clonal (the recombination of IGH and IGL CDR3s) expansion, gene
usage, and CDR3 sequencing length analyses.

#### 460 SLA alleles annotation from scRNA-seq data

The Cellranger mkgtf was used to build the SLA alleles reference using the SLA FASTA files downloaded from the IPD-MHC database(13). Afterwards, SLA reads were quantified using Cellranger count command, SLA counts were log normalized, and then the average expression of each SLA allele in each sample was computed with the AverageExpression function in Seurat. The data were visualized in heatmap using ComplexHeatmap (v2.25.1) (57) and scaled for PCA analysis.

#### 467 **Data availability**

The sequencing data are available at Gene Expression Omnibus (accession GSE277475). Processed single-cell RNA sequencing objects are available for online visualization at https://singlecell.broadinstitute.org/single\_cell/study/SCP2783 and https://singlecell.broadinstitute.org/single\_cell/study/SCP2779. All relevant data are available from the authors.

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669	Figure 1. Single-cell transcriptomic analysis of IAV-infected CD1D-/- and CD1D-/+ pig lungs.
670	(A) Overview of experiment setup. 3 <i>CD1D</i> -/- and 3 <i>CD1D</i> -/+ pigs were infected with pdmH1N1
671	IAV. Fourteen days later, the same 6 pigs were infected with H1N1 A/Missouri/CS20N08/2020
672	(MO20) IAV (designated 2X pigs) along with an additional 3 CD1D-/- and 3 CD1D-/+ pigs
673	(designated 1X pigs). Necropsies were performed 5 days after the MO20 infection to collect lung
674	tissue for single-cell immune profiling. Created with BioRender. (B) Uniform manifold
675	approximation and projection (UMAP) visualization of lung leukocyte populations colored by cell
676	clusters. Clusters were identified using the graph-based Louvain algorithm at a resolution of 0.5.
677	(C) The frequency of each cell type is presented for each treatment. (D) Bar graphs displaying the
678	number of upregulated and downregulated differentially expressed genes (DEGs) in 1X compared
679	to 2X CD1D-/+ and CD1D-/- pigs. (E) Bar graphs displaying the number of DEGs in CD1D-/+
680	compared to CD1D-/- pigs after 1X or 2X infections.
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# 690 Figure 2



708 Figure 2. Characterization of T cell clonotypes from lung tissue. (A) UMAP plot of cells 709 expressing one (tra, trb) or both (tratrb) TCR  $\alpha$  and TCR  $\beta$  chains. (B) UMAP plot of cells with 710 paired TCR $\alpha$  and TCR $\beta$  chains that were used for downstream analysis. (C) Relationship between TRBV and TRBJ usage in T cell receptor rearrangements by treatment. Cell barcode counts for 711 712 TRBV and TRBJ gene segments were normalized by cell numbers across treatments and scaled 713 by TRBV segments. (D) Principal component analysis of TRBV and TRBJ gene usages by 714 individual pig. (E and F) Heatmaps showing row-scaled mean expression of the 10 highest 715 differentially expressed SLA class I (E) and SLA class II (F) genes per pig. (G) Heatmap of 716 overlapping clonotypes between pigs. (H) Proportion of clonotypes by treatment with  $1, 2, \ge 3$ cells per clonotype. (I) Abundance of clonotypes by cluster with 1, 2,  $\geq$  3 cells per clonotype in 717 the combined dataset. (J) Expression of naive and activation T cell markers in expanded and non-718 719 expanded clonotypes in the combined dataset. (K) UMAP plot displaying the five most expanded clonotypes defined by identical CDR3ß region sequences in the combined dataset. (L and M) 720 Number of cells in each of the five most expanded clonotypes by treatment (L) and cluster (M). 721 722

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# 729 Figure 3

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747	Figure 3. B cell receptor repertoire profiling of lung tissue B cells. (A) UMAP plots of cells
748	expressing IGK and IGL chains and IGHM, IGHG, and IGHA chains. (B) Proportion of cells
749	expressing IGK and IGL in each B cell cluster. (C) Percentage of cells expressing IGHM, IGHG,
750	and IGHA in each B cell cluster. (D) Percentage of IGHG+ cells expressing different porcine IGHG
751	subclasses in each B cell cluster. (E) Number of cells expressing light and heavy chain V(D)J gene
752	segments. (F) Percentage of clonotypes by cluster with $1, 2, \ge 3$ cells per clonotype. (G) Percentage
753	of clonotypes by IGH chain with 1, 2, $\geq$ 3 cells per clonotype. (H) Proportion of cells expressing
754	IGHM, IGHG, and IGHA by treatment. (I) Percentage of clonotypes by treatment with 1, 2, $\geq$ 3
755	cells per clonotype. (J) Percentage of IGHG+ cells expressing different porcine IGHG subclasses
756	by treatment. (K) Length of light and heavy chain CDR3 sequences by treatment.
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785	Figure 4. Single-cell transcriptomic analysis of T cells isolated from lung lavage fluid. (A)
786	Overview of experiment setup. T cells were FACS-sorted from the lung lavage fluid of 3 infant
787	pigs: two pdmH1N1-vaccinated and -infected pigs (FLU1 and FLU2) and one naïve pig (NAÏVE).
788	FLU pigs were sampled 3 days before IAV infection (T1) and again 7 days after infection (T2).
789	The NAÏVE pig was sampled at 28 (T1) and 33 (T2) days of age. Created with BioRender (B)
790	FACS plot showing acquisition of lung lavage T cells. (C) UMAP plot of the combined T cell
791	datasets. (D) UMAP plots displaying individual samples. (E) Examples of genes used to identify
792	resident (BHLHE40, CXCR3) and circulating (SELL, S1PR1) T cells. (F) Proportions of T cell
793	subsets in FLU1 and FLU2 pigs at T1 and T2 timepoints. (G) Heatmap of 10 gene modules whose
794	genes had a similar expression pattern across cell clusters. (H) UMAPs showing select genes from
795	modules 1-10.
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# 806 Figure 5





Figure 5. T cell clonotype tracking using VDJ recombination at the TRB locus. (A) UMAP plot 824 of cells expressing one (tra, trb) or both (tratrb) TCR  $\alpha$  and TCR  $\beta$  chains in the combined dataset. 825 826 (B) Phylogenetic trees of TCR $\alpha$  and TCR $\beta$  sequences in the FLU1 T1 sample. (C) Heatmap of overlapping clonotypes between samples. (D) Abundance of clonotypes by cluster with  $1, 2, \ge 3$ 827 828 cells per clonotype in the combined dataset. (E) UMAP plot displaying the five most expanded clonotypes in the combined dataset. (F) Number of cells in each of the five most expanded 829 830 clonotypes by sample. (G) Proportion of the most abundant clonotypes in FLU1 and FLU2 pigs 831 by sample time. (H) Heatmap displaying the most abundant CDR3<sup>β</sup> 4-mer motifs in each pig normalized by cell numbers in each sample. (I) T cell clones expressing the CDR3ß sequence 832 833 ASSPGQGYEQ that matches a human CDR3ß sequence recognizing the human HLA-A\*0201 834 M1 epitope GILGFVFTL.