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# The duck genome and transcriptome provide insight into an avian influenza virus reservoir species

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The duck (*Anas platyrhynchos*) is one of the principal natural hosts of influenza A viruses. We present the duck genome sequence and perform deep transcriptome analyses to investigate immune-related genes. Our data indicate that the duck possesses a contractive immune gene repertoire, as in chicken and zebra finch, and this repertoire has been shaped through lineage-specific duplications. We identify genes that are responsive to influenza A viruses using the lung transcriptomes of control ducks and ones that were infected with either a highly pathogenic (A/duck/Hubei/49/05) or a weakly pathogenic (A/goose/Hubei/65/05) H5N1 virus. Further, we show how the duck's defense mechanisms against influenza infection have been optimized through the diversification of its  $\beta$ -defensin and butyrophilin-like repertoires. These analyses, in combination with the genomic and transcriptomic data, provide a resource for characterizing the interaction between host and influenza viruses.

Birds are distinct from other vertebrates in many characteristics, both morphological (for example, feathers and eggs) and physiological (for example, their lightweight skeletons and high metabolic rates). Birds occupy habitats from the Arctic to the Antarctic, and they have body size ranging from 5 cm to 2.8 m. The diversity found in birds inspires us to investigate the genomic differences underlying their phenotypic differences from mammals and the variation within the avian class. The sequencing of the chicken genome<sup>1</sup> provided the first insight into the evolutionary events between birds and other vertebrates. Avian evolutionary events have subsequently been elucidated with the recent availability of the zebra finch and turkey genomes<sup>2,3</sup>. Additional avian genomes, however, are needed to provide more detailed evolutionary information and insight into adaptation mechanisms. The duck (*A. platyrhynchos*) is particularly well suited for further exploration

in these areas. Ducks diverged from the related chicken and turkey and zebra finch approximately 90–100 million years ago<sup>4</sup>. The duck is also one of the most economically important waterfowl as a source of meat, eggs and feathers.

Of special interest to medicine and agriculture is the fact that ducks serve as the principal natural reservoir for influenza A viruses and harbor all 16 hemagglutinin (HA) and 9 neuraminidase (NA) subtypes that are currently known<sup>5,6</sup>, with the exception of the H13 and H16 subtypes<sup>7</sup>. Often, influenza strains cause the duck no harm. However, the long-standing equilibrium between influenza A viruses and the duck has been disrupted with the emergence of H5N1 viruses<sup>8</sup>. H5N1 strains have caused unprecedented outbreaks in poultry in more than 60 countries and have caused 622 human infections (as of March 2013), with an overall fatality rate of 59% in humans. Recently, it was

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Table 1 Number and length of reads and number of genes detected using RNA sequencing in control and H5N1 virus-infected ducks

Group	Total reads	Total length of reads (bp)	Number of expressed genes	Number of uniquely mapped reads		Number of DEGs and PSGs <sup>a</sup> (versus control)			Number of DEGs and PSGs <sup>a</sup> (versus GS/65-infected ducks)		
				Genome	Gene	DEGs	Frequency of PSGs	DEG set	DEGs	Frequency of PSGs	DEG set
Control	146,618,064	13,195,625,760	18,181	84,895,562	72,455,573						
DK/49 (day 1)	116,561,634	10,490,547,060	18,276	60,873,691	49,811,986	2,257	63/957		1,506	38/624	
DK/49 (day 2)	133,943,194	12,054,887,460	18,233	73,475,680	59,066,187	3,101	89/1,413		1,436	44/654	
DK/49 (day 3)	136,923,500	12,323,115,000	17,951	81,116,464	65,172,557	3,066	86/1,383	5,038	1,396	44/625	3,232
GS/65 (day 1)	138,642,320	12,477,808,800	18,135	81,176,979	66,830,938	916	20/367				
GS/65 (day 2)	127,576,536	11,481,888,240	18,140	72,750,242	58,940,732	2,060	58/918				
GS/65 (day 3)	116,267,820	10,464,103,800	17,983	69,337,186	56,072,340	1,251	29/538	2,741			

<sup>a</sup>DEGs are genes that showed significantly different expression with FDR  $\leq 0.001$  and fold change  $\geq 2$ . PSGs are genes that are predicted to be under positive selection with FDR < 0.05. The numerator and denominator for the frequencies of PSGs are the number of positively selected genes and genes where a likelihood ratio test was performed for PSGs, respectively.

reported that an engineered influenza virus encoding hemagglutinin from the highly pathogenic avian H5N1 influenza A strains can be transmitted between ferrets<sup>9</sup>, emphasizing the potential for a human pandemic to emerge from birds. Furthermore, weakly pathogenic avian influenza A viruses, such as H9N2 (ref. 10) and H7N2 (ref. 11) strains, have caused transient infections in humans<sup>12</sup>. The exceptional virulence of avian influenza viruses in humans, in combination with their ongoing evolution in birds, motivates us to better understand host immune responses to avian influenza viruses. We report here the duck whole-genome sequence and compared it to the genomes of mammals and other birds. We performed deep transcriptome analyses of lungs from control ducks and ones that were infected with either a highly pathogenic (A/duck/Hubei/49/05, DK/49) or a weakly pathogenic (A/goose/Hubei/65/05, GS/65) H5N1 virus<sup>13</sup>.

## RESULTS

### The genome landscape

We sequenced the genome of a 10-week-old female Beijing duck using methods similar to those applied to sequence the giant panda genome<sup>14</sup>. In total, we generated 77 Gb of paired-end reads (approximately 64-fold coverage of the whole genome) with an average length of 50 bp (**Supplementary Figs. 1–3** and **Supplementary Table 1**). Using SOAPdenovo (**Supplementary Note**), we combined short reads to generate a draft assembly, which consisted of 78,487 scaffolds and covered 1.1 Gb. The contig N50 and scaffold N50 values of this draft assembly were 26 kb and 1.2 Mb, respectively (**Supplementary Table 2**). We then constructed superscaffolds and created chromosomal sequences according to the duck genetic map<sup>15</sup> and the comparative physical map<sup>16</sup>. This effort resulted in the construction of a total of 47 superscaffolds, which contained 225 scaffolds and spanned 289 Mb (**Supplementary Table 3**).

We generated transcriptomes from several different tissues (**Supplementary Note**). These transcriptomes comprised 1.87 million ESTs and approximately 121 million 75-bp and approximately 917 million 90-bp paired-end reads, which were generated using either the 454/Roche Life Sciences Analyzer or Illumina Genome sequencing technology (**Table 1** and **Supplementary Tables 4** and 5). Next, we estimated the coverage of the duck assembly with alignments to seven finished BACs (completed independently using Sanger sequencing technology<sup>17</sup>), 240 microsatellite markers<sup>15</sup> and the 319,996 ESTs assembled in this project (**Supplementary Note**) using BLASTN (*E* value <  $1 \times 10^{-5}$ ). These analyses suggested that 7 BACs covering 640 kb on chromosomes 1, 3 and 4 were aligned over more than 95% of their lengths (**Supplementary Fig. 4**). Similarly, greater than 97% of 240 microsatellite markers and 96% of the 319,996 ESTs were

aligned to the duck assembly. We further aligned the duck and chicken assemblies to the human using Narcisse. This effort showed that the coverage of the two avian assemblies of the human genome (GRCh37) was similar, indicating that the quality of the duck and chicken assemblies was comparable. In addition, in aligning the duck assembly onto the chicken genome sequence using GLINT software with its default parameters<sup>18</sup>, only 41 of the 78,847 duck scaffolds were identified as possible chimeras when applying the criterion that they contain sequences that partially map to two different chicken chromosomes. These data indicate that the duck assembly has good coverage and generally provides a reasonable substrate for the analysis presented in this study.

We defined reference gene sets from the duck assembly using the BGI and Ensembl pipelines (Supplementary Note). For the BGI reference set, we aligned the duck transcriptome data and human (22,232) and chicken (16,701) genes to the duck genome assembly, yielding 15,065 predicted protein-coding duck genes. We applied GENSCAN<sup>19</sup> and Augustus<sup>20</sup> with the default parameters and predicted 32,383 and 22,739 protein-coding genes in the duck draft genome for the respective reference sets (Supplementary Table 6). Finally, we integrated all gene sources and created a reference set containing 19,144 genes, constituting approximately 2.3% of the total duck assembly. Of these 19,144 genes, 9,678 were mapped to categories established by the Gene Ontology (GO) Project, 14,725 had orthologs in the Kyoto Encyclopedia of Genes and Genomes (KEGG) database, and 18,012 were supported by the duck ESTs (Supplementary Figs. 5 and 6). Comparing the BGI reference gene set to the Ensembl reference gene set, which contained 15,634 protein-coding genes (Supplementary Note), we found that 14,049 of the BGI reference genes and 13,811 of the Ensembl reference genes were predicted by both pipelines, whereas the remaining 5,095 and 1,823 genes from the two sets, respectively, were annotated with the BGI and Ensembl pipelines alone. We predicted 817 noncoding RNA genes in the duck assembly with a homology-based annotation method (Supplementary Tables 7 and 8 and Supplementary Note). In addition, we identified 29 families of DNA transposons, 61 families of retrotransposons and 414 families of microsatellites, comprising 5.9% of the duck genome (Supplementary Table 9 and Supplementary Note).

### Changes in gene family size

We examined large-scale differences in gene complements within birds and between birds and either mammals or fish using the duck reference gene set and combined gene sets from three birds, one reptileamphibian, three fish and eight mammals (**Fig. 1**). Using a likelihood model<sup>21</sup>, we estimated at least 23,044 genes distributed in 14,466 gene **Figure 1** Numbers of gene losses and gains across 17 vertebrates. Data are shown for 17 vertebrates, 3 teleosts, 5 reptilians and 8 mammals. The numbers of gene gains (+) and losses (–) are given on branches or to the right of the taxa. The rates of gene gain and loss for the clades derived from the MRCAR (MRCA of reptiles), MRCAT (MRCA of teleosts) and MRCAM (MRCA of mammals) and for *Xenopus tropicalis* are 0.0011, 0.0012, 0.0017 and 0.0019 per gene per million years, respectively.

families in the most recent common ancestor (MRCA) of 17 vertebrates (**Fig. 1**). We estimated the average rate of change across all 14,466 gene families in the MRCA via maximum likelihood under a single- or multiple-rate model for each clade<sup>21</sup>. A comparison of likelihood values showed that the best-fit model (P < 0.01) estimated the average rates of genomic turnover (represented by the  $\lambda$  value, given per gene per million years) to be 0.0012 for teleosts, 0.0019 for *Xenopus tropicalis*, 0.0011 for reptiles (including birds) and 0.0017 for mammals. These estimates are similar to previous values for yeast (0.0020)<sup>21</sup>, *Drosophila melanogaster* (0.0023)<sup>22</sup> and mammals (0.0017)<sup>23</sup>, supporting the theory that rates of gene duplication and deletion across eukaryotes are comparable.

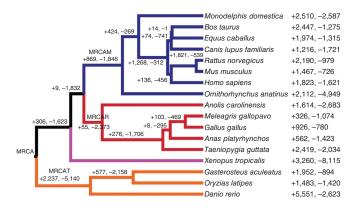
We compared gene family sizes at parent and daughter nodes along the vertebrate tree (**Fig. 1**), finding that the total numbers of contractions outnumbered expansions in the MRCAs of teleosts, mammals and reptiles. This tendency, where contractions outnumbered expansions, was continued into the duck and turkey. However, the reverse case, where expansions outnumbered contractions, seemed to be true in the chicken and zebra finch. From the terminal branch leading to the duck and chicken, we inferred a gain of 562 out of 1,029 genes and a loss of 1,423 out of 1,249 genes in ~90 million years (**Fig. 1**).

### Expansion and contraction of immune gene families

We identified the predicted duck, chicken and zebra finch genes that were homologs of 3,542 human and 1,415 mouse immune genes (comprising 4,344 unique immune genes), which were derived from analyses of Import, IRIS, Septic Shock Group, MAPK–NF- $\kappa$ B network and immunome databases using TreeFam<sup>24</sup>. In total, 6,044 human and 5,715 mouse genes were clustered into 3,726 immune-related gene families, all of which included at least one of the 4,344 unique immune genes. However, only 3,116 duck genes, 3,294 chicken genes and 3,355 zebra finch genes were clustered into the immune-related gene families, indicating that avian immune gene repertoires were contractive.

We used cytokines as an example to compare immune gene repertoires in mammals and birds. After detecting cytokines in the above five species with TreeFam<sup>24</sup>, we manually queried their repertoires against the non-redundant database in NCBI and examined their assemblies in Ensembl (version 57). Using the combined duck transcriptome and assembly data, we identified 150 duck cytokine genes; although this number resembles the numbers of such genes identified in chicken (149 genes) and zebra finch (150 genes), it is substantially lower than the numbers of mammalian cytokine genes (230 in humans and 218 in mice) (**Table 2**).

We found that the duck genome contains 16 defensins distributed over 3 scaffolds, a number that was slightly higher than that of the 14 defensins found in chicken<sup>25</sup>. Closing the sequence gaps within the three scaffolds via Sanger sequencing, we identified three additional duck defensin genes (including one pseudogene). Structural and phylogenetic analyses of avian defensins and mammalian  $\beta$ -defensins showed that all duck defensins are  $\beta$ -defensins (**Supplementary Fig. 7a**), supporting the hypothesis that birds lack  $\alpha$ - and  $\theta$ -defensins<sup>25,26</sup>.



Molecular phylogenetic analysis indicated that the avian defensin genes were divided into 12 subfamilies: 1 subfamily (AvDB14) lost its member in the zebra finch, 2 subfamilies (AvDB1-AvDB3 and AvDB6-AvDB7) contained lineage-specific duplications (LSDs), and 9 subfamilies (AvDB2, AvDB4, AvDB5 and AvDB8-AvDB13) remained one-to-one orthologs in three birds (Supplementary Fig. 7a). Evolutionary comparison of the avian defensin genes suggested that single clusters of these genes in duck, chicken and zebra finch were collinear, with the exception of AvDB1, AvDB3 and AvDB14 (Supplementary Fig. 7b). These observations suggest that the ancient Neognathae had 13 avian defensin genes, including AvDB1-AvDB5 and AvDB7-AvDB14. Gene duplications along with the pseudogenization of defensin genes further increased the repertoire of these genes in both duck and zebra finch. Two gene duplication events of AvDB1 have been described in the zebra finch; however, duplication of the ancient AvDB7 gene seems to have led to the introduction of the AvDB6 gene in chicken.

## LSDs in birds

Using a cutoff of 2 duplication events, we identified 5, 76, 577 and 1,752 LSDs in turkey, duck, chicken and zebra finch, respectively (**Supplementary Note**). Of the 14 gene families that contained 76 duck LSDs, we found that 3 were significantly expanded in this lineage (familywide *P* value < 0.0005). One family is a BTNL (butyrophilin-like) family, which includes the mammalian BTNL genes, with the exception of *BTNL9* (**Supplementary Fig. 7c**). Domain prediction using SMART software<sup>27</sup> suggested that 6 out of 17 duck gene fragments encoded a structure that was typical of BTNLs<sup>28</sup>. The high prevalence of these genes in duck is in sharp contrast to their frequency in chicken and turkey, where only 1 or 2 out of 4 genes encoded this structure (**Supplementary Fig. 7d**). The second family significantly expanded in the duck lineage was an olfactory receptor gene family, and the third family was a novel gene family that included only five duck epidermal growth factor (EGF)-like genes (**Supplementary Table 10**).

## **Evidence for positive selection**

We performed likelihood ratio tests (LRTs) for positive selection with the codeml program under a branch-site model<sup>29</sup> using 8,409 avian quaternions (**Supplementary Note**). These LRTs (false discovery rate (FDR) <0.05) predicted that 2.7%, 5.2%, 6.2% and 10.9% of genes showed evidence of positive selection in chicken, duck, zebra finch and turkey, respectively. These proportions are significantly lower than the previously reported values (10.7% in chicken and 11.3% in zebra finch)<sup>30</sup>. This large variation in the proportion of genes showing evidence of positive selection within a particular lineage is partly attributed to alignment problems and poor sequence quality<sup>31,32</sup>. A comparison across species suggested that the proportion of

		Number of genes						
Class	Family	Duck	Chicken	Zebra finch	Human	Mouse		
Class I cytokines	IL-2 receptor	7	7	7	8	8		
	IL-3 receptor	2	2	1	3	3		
	IL-6 receptor	8	7	8	12	12		
	Single-chain family	4	3	6	6	4		
Class II cytokines	Type I interferons	4	6	4	20	17		
	Type II interferons	1	1	1	1	1		
	IL-10 family	4	4	4	6	5		
PDGF family	Cysteine-knot growth factors	8	8	8	9	9		
	4-helix bundle growth factors	0	0	0	2	2		
	β-trefoil growth factors	19	19	21	22	21		
	Other growth factors	15	17	18	20	20		
TNF family		11	11	10	18	18		
IL-1 family		2	3	2	10	9		
IL-17 family		5	5	6	6	6		
TGF-β family	BMP2 subfamily	2	2	2	2	2		
	BMP5 subfamily	4	4	2	5	5		
	GDF5 subfamily	3	2	2	3	3		
	VGL subfamily	1	1	1	2	2		
	BMP3 subfamily	2	2	3	2	2		
	ADMP	2	2	2	0	0		
	Intermediate members	5	4	5	5	5		
	Activin subfamily	4	2	2	4	4		
	TGF subfamily	3	3	2	3	3		
	Distant members	6	6	6	8	8		
Chemokines	CC chemokines	13	14	12	28	27		
	CXC chemokines	8	8	8	17	14		
	CXC3C chemokines	2	1	2	1	1		
	C chemokines	1	1	1	2	1		
Total		150	149	150	230	218		

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positively selected genes in duck was in the range of the proportions detected in high-quality genomes, such as those of the chicken (2.7%) and zebra finch (6.2%). This observation, along with reports from the assessment of the quality of the duck draft genome (Supplementary Note), encouraged us to further investigate the biological functions of positively selected genes in the duck. Ingenuity Systems Pathway Analysis (IPA) showed that positively selected genes in duck were enriched in cellular assembly and organization, cellular function and maintenance, and cell signaling. In addition, genes related to amino acid metabolism and small-molecule biochemistry tended to be under positive selection in duck (Supplementary Table 11).

### Gene profiles after avian influenza virus infections

We examined global gene expression profiles using seven lung transcriptomes of ducks infected with H5N1 viruses and control individuals (Table 1). Alignment of approximately 916 million Illumina paired-end reads with the merged reference gene set suggested that between 17,951 and 18,276 genes were expressed in these lung tissues, and 16,404 genes were transcribed in all 7 lung tissues. In general, the overall gene expression patterns of DK/49-infected animals 1-2 d after inoculation were similar to those of GS/65-infected animals 1 d after inoculation, whereas the gene expression profiles of DK/49-infected animals 3 d after inoculation were similar to those of GS/65-infected animals 2-3 d after inoculation (Fig. 2a). Compared to control animals, DK/49-infected ducks had 2,257, 3,101 and 3,066 genes with significantly altered expression (FDR ≤0.001, fold change  $\geq$ 2) 1–3 d after inoculation, and GS/65-infected ducks had 916, 2,060 and 1,251 genes with significantly altered expression (FDR  $\leq 0.001$ , fold change  $\geq 2$ ) 1–3 d after inoculation (Table 1).

These findings, together with hierarchical clustering analysis, showed an appreciably more dynamic response during infection with GS/65 virus compared to DK/49 virus. Further comparison suggested that 1,506, 1,436 and 1,396 genes had significantly different expression levels (FDR ≤0.001, fold change  $\geq 2$ ) in DK/49-infected ducks and GS/65-infected ducks 1-3 d after inoculation, respectively (Table 1 and Supplementary Fig. 8). Compared to the duck reference gene set (with 5.2% predicted to be under positive selection), these sets of differentially expressed genes were predicted to have a slightly higher proportion of genes (5.4-7.0%) under positive selection (Table 1), supporting the hypothesis that ducks might alter their sensitivity to avian influenza viruses through the positive selection of many genes evolving in the host response to these viruses<sup>33,34</sup>.

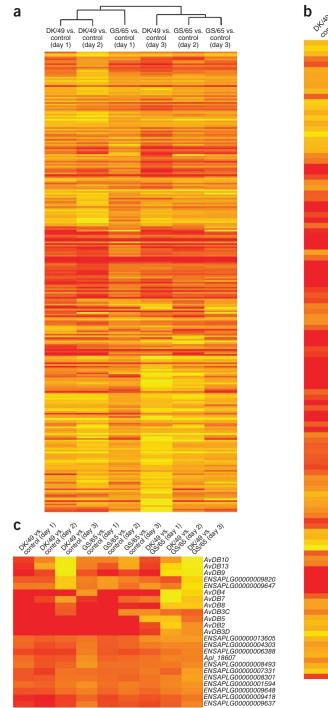
We merged the sets of genes determined to have differential expression in DK/49- or GS/65-infected ducks compared with control animals into set 1 (5,038) and set 2 (2,741), respectively, and we combined the genes with differential expression in DK/49- and GS/65infected ducks into set 3 (3,232) (Table 1). IPA of sets 1 and 2 identified four enriched categories related to cell activation and one enriched category associated with antigen presentation (P < 0.0005; Supplementary

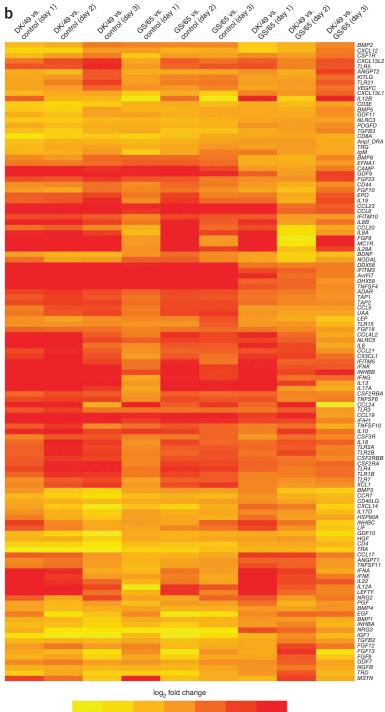
Table 12), suggesting that ducks infected with DK/49 or GS/65 virus both have severe disruption of cellular functions. IPA of set 3 also identified three enriched categories related to cell activation (cellular movement, cellular growth and proliferation, and cellular development), as well as one associated with molecular transport and one related to lipid metabolism (Supplementary Table 12).

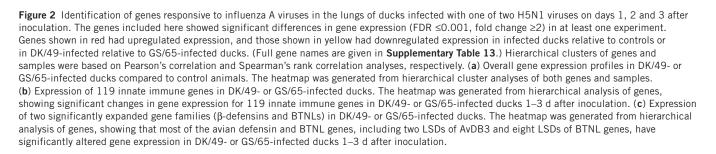
### Innate immune response in avian influenza virus infections

Transcriptome analysis of 150 cytokines (listed in Table 2) showed that, compared to control ducks, ones infected with DK/49 or GS/65 had 74 cytokines with expression levels that were significantly changed (FDR  $\leq$  0.001, fold change  $\geq$  2) 1–3 d after inoculation (Fig. 2b; full gene names are given in Supplementary Table 13). Of these cytokines, 20 growth factor genes (BMP1-BMP5, EGF, FGF9, FGF12, FGF13, GDF10, GDF11, HGF, IGF1, INHBA, NGFB, NRG3, PDGFD, PGF, TGFB2 and TGFB3) had expression that was significantly decreased by 2.0- to 9.8-fold, and 13 growth factor genes (BMP8, EFNA1, FGF8, FGF18, FGF23, GDF9, INHBB, INHBC, KITLG, MSTN, NODAL, NRG2 and VEGFC) had expression that was significantly increased by 2.1- to 379-fold with DK/49 or GS/65 infection. Similarly, one tumor necrosis factor (TNF) gene (TNFSF11), one interleukin (IL)-17 gene (IL17D) and three CXC chemokine genes (CXCL12, CXCL13L2 and CXCL14) had expression that was markedly decreased by 2.2- to 5.8-fold, whereas one IL-17 gene (IL17A), three TNF genes (TNFSF4, TNFSF6 and TNFSF10) and four CXC chemokine genes (CX3CL1, CXCL13, IL8A and IL8B) had expression that was markedly increased by 2.3- to 34-fold after infection with DK/49 and GS/65. However, all five interferon genes (IFNA, IFNE, IFNG, IFNK and IL28A), one C chemokine gene (XL1), nine

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CC chemokine genes (*CCL4L2*, *CCL5*, *CCL6*, *CCL17*, *CCL19*, *CCL20*, *CCL21*, *CCL23* and *CCL24*) and ten interleukin or interleukin receptor genes (*IL1*, *IL6*, *IL10*, *IL13*, *IL12A*, *IL12B*, *IL19*, *IL22*, *LEP* and *LIF*) had expression that was markedly upregulated by 2.1- to 1,414-fold in DK/49- or GS/65-infected ducks compared with control ducks. Compared with GS/65-infected ducks, DK/49-infected ducks had 7 cytokine genes with expression that was elevated by 2.4- to 46-fold 1–2 d after inoculation that then had expression decreased by 2.3- to 7-fold 2–3 d after inoculation, 12 cytokine genes with expression that was significantly downregulated (by 2.0- to 4.2-fold) and 38 cytokine genes with expression that were significantly upregulated (by 2.0- to 1,414-fold) 1–3 d after inoculation (FDR ≤0.001, fold change ≥2; **Fig. 2b**).

DDX58, IFITM3 and IFIT1-IFIT3 have key roles in the antiviral response to avian influenza virus infection<sup>35-37</sup> in mammals. Transcriptome analysis showed that the expression levels of the DDX58, IFITM3 and AvIFIT genes (the gene name of AvIFIT is given in Supplementary Fig. 9) in both DK/49- and GS/65-infected ducks were markedly increased by 6.9- to 440-fold 1-3 d after inoculation, with peak expression (increased by 12.5- to 440-fold) at 2 d, compared with control ducks (Fig. 2b). Similar to DDX58, two additional RNA helicases (ADAR and DHX58) showed expression that was significantly elevated by 2.1- to 30-fold 1-3 d after inoculation, with peak expression (increased by 3.2- to 30-fold) at 2 d, in both DK/49- and GS/65-infected ducks compared with control ducks, indicating that these three RNA helicases have key roles in the host response to avian influenza viruses in duck. Moreover, similar to AvIFIT, which had altered gene expression in infected ducks, the genes for three additional interferon-induced proteins (IFIH1, IFITM5 and IFITM10) showed significantly different expression levels during infection with DK/49 virus 1-3 d after inoculation, with peak expression at 2 d. Pronounced changes in gene expression for IFIH1, IFITM5 and IFITM10 were observed in the GS/65-infected ducks 2 d after inoculation, whereas only minor changes in IFITM5 and IFITM10 expression were detected in GS/65-infected ducks at 1 and 3 d after inoculation (Fig. 2b). Toll-like receptors (TLRs) are involved in host-virus interactions and lead to the secretion of interferons by infected cells. Consistent with the changes observed in the expression of the five interferon genes, nine TLR genes, including two members not found in mammals (TLR15 and TLR21), had expression that was significantly increased by 2.0- to 7.5-fold in DK/49- or GS/65-infected ducks 1–3 d after inoculation compared with control ducks (Fig. 2b). However, the immunoglobulin M (IgM) locus, three T cell receptors genes (TRA, TRD and TRG) and four genes encoding CD molecules (CD3E, CD4, CD8A and CD40LG) showed significantly decreased expression in DK/49- or GS/65-infected ducks compared with control ducks (FDR  $\leq$ 0.001, fold change  $\geq$ 2). In addition, three major histocompatibility complex (MHC) genes (Anpl-DRA, TAP1 and TAP2) and four colony-stimulation factor receptor genes (CSF2RA, CSF2RBA, CSF2RBB and CSF3R) had significantly elevated expression in DK/49- or GS/65-infected ducks compared with control ducks (FDR  $\leq$ 0.001, fold change  $\geq$ 2; **Fig. 2b**).

### LSDs of immune genes responsive to avian influenza viruses

Mammalian defensins have been proposed to contribute to the immune response to avian influenza virus infection. In mice, the expression of  $\beta$ -defensins 3 and 4 is significantly higher in avian influenza virus–infected airways<sup>38</sup>, and, in humans,  $\beta$ -defensins inhibit avian influenza virus replication and increase the uptake of these viruses by neutrophils<sup>39</sup>. Similarly, key roles for BTNLs in immune responses have been extensively reported in mammals: four BTNLs

(*BTNL1*, *BTNL2*, *BTNL4* and *BTNL6*) can attenuate T cell activation and antagonize pathological inflammatory T cell infiltrates<sup>28,40</sup>. However, the functions of avian defensins and BTNLs in immune responses to influenza viruses in birds are uncertain.

Transcriptome analysis indicated that eight avian defensin genes (AvDB2, AvDB3C, AvDB3D, AvDB4, AvDB5, AvDB7, AvDB8 and *AvDB9*), including two LSDs of these genes (*AvDB3C* and *AvDB3D*), had expression that was markedly increased by 7.6- to 1,551-fold (FDR ≤0.001, fold change ≥2) in DK/49- or GS/65-infected ducks compared with controls. Unexpectedly, AvDB10 and AvDB13 showed expression that was significantly elevated by 3.9- to 5.1-fold 1 d after inoculation that returned to normal, basal levels at 2 d and was downregulated by 8.6- to 12-fold at 3 d in DK/49-infected ducks. However, such pronounced changes in AvDB10 and AvDB13 expression were not detected 1-3 d after inoculation in GS/65-infected ducks, where significant change in gene expression was only observed for AvDB13 2 d after inoculation (Fig. 2c). Compared with GS/65-infected ducks, DK/49-infected ducks had three avian defensin genes (AvDB2, AvDB4 and AvDB9) with expression that was significantly increased by 3.1- to 971-fold 1 d after inoculation, and the reverse was true (with expression significantly decreased by 3.1- to 971-fold) 2 d after inoculation (Fig. 2c). Moreover, two avian defensin genes (AvDB3D and AvDB8) had expression that was significantly elevated by 4.1- to 8.9-fold 1 d after inoculation, and one defensing gene (AvDB7) had expression that was significantly decreased by 9.8-fold at 2 d in DK/49infected ducks compared with GS/65-infected ducks (Fig. 2c). Of the 17 BTNL genes, 11 genes, including 8 LSDs, showed expression that was markedly elevated by 2.0- to 7.5-fold 1-3 d after inoculation in DK/49- or GS/65-infected ducks compared with control individuals. In comparison with GS/65-infected ducks, DK/49-infected ducks had one BTNL gene with expression that was markedly decreased by 4.5-fold and five BTNL genes, including three LSDs, with expression that was substantially increased by 2.1- to 3.2-fold (Fig. 2c).

## DISCUSSION

We draw four noteworthy conclusions from our results. First, using nextgeneration sequencing technology, we generated the first draft sequence for a waterfowl, one which is a natural host of avian influenza viruses. Second, we showed that immune-related gene repertoires in three bird lineages (including 3,116–3,355 genes) seemed to be contractive compared to equivalent repertories in mammals (with 5,715–6,044 genes). Further efforts identified about 150 cytokines in three bird species using assemblies in Ensembl57 and the NCBI non-redundant database (as of November 2012), whereas there were about 220 cytokines in 2 mammal species (**Table 2**). Third, we performed deep transcriptome analysis to characterize gene expression profiles and to identify genes that are responsive to avian influence viruses (for example, *AvIFT*, *AvDB7–AvDB10*, *IFITM5* and *IFITM10*). Fourth, we found that some LSDs of avian defensin and BTNL genes might be involved in host immune response to both of the two H5N1 viruses whose infection was examined in ducks.

The duck genome possesses a contractive immune-related gene repertoire similar to those of the chicken and zebra finch, and it includes genes that are not present in the other three species whose genomes have been sequenced (**Fig. 1**). In the analyses presented here, we found that many genes (for example, BTNLs and defensins) were independently duplicated in the duck but not in the chicken genome. These results suggest that gene gain and loss have influenced the divergence of the four avian genomes and the evolution of their respective immune systems.  $\beta$ -defensins are induced in response to influenza virus infection<sup>38</sup>, and BTNLs are involved in T cell activation and infiltration in mammals<sup>28,40</sup>. Notably, most of the defensin and

# ARTICLES

BTNL genes, including two LSDs of AvDB3 and eight LSDs of BTNL genes, may be implicated in the host immune response to influenza in duck; therefore, a functional analysis of the defensins and BTNLs of birds will be of interest to the study of avian influenza virus infection. Moreover, the duck seems to benefit from positive selection on specific genes functioning in the host-virus interaction. This presence of this benefit is supported by the detection of slightly higher frequencies of positively selected genes in the sets of differentially expressed genes identified following infection with H5N1 viruses compared to the duck reference gene set reported in this study. The protein sequences of the two H5N1 viruses investigated in this study are highly conserved, with the exception of 20 amino acid alterations distributed over 7 genes; however, one virus is highly pathogenic (DK/49), and the other is weakly pathogenic (GS/65) in ducks<sup>13</sup>. Notably, the optimized immune system of ducks can be overcome by the highly pathogenic H5N1 virus but not by the weakly pathogenic H5N1 virus. This distinction identifies disruptions in the long-standing equilibrium between ducks and avian influenza viruses. Our future ability to assess the functions of genes showing significantly different expression induced by highly pathogenic H5N1 viruses compared with weakly pathogenic H5N1 viruses, using genetic manipulations and co-evolutionary analyses, will certainly extend knowledge of the avian genes related to influenza in birds.

URLs. Cumulative number of confirmed human cases of avian influenza A (H5N1) infection reported to the World Health Organization, http://www.who.int/influenza/human\_animal\_interface/H5N1\_ cumulative\_table\_archives/en/index.html; influenza activity in the United States and worldwide, 2004–2005 season, http://www.cdc. gov/mmwr/preview/mmwrhtml/mm5425a3.htm; Narcisse, http:// narcisse.toulouse.inra.fr/multi/cgi-bin/narcisse.cgi; InnateDB, http:// www.innatedb.com/index.jsp; Ingenuity Systems Pathway Analysis (IPA), http://www.ingenuity.com/.

## METHODS

Methods and any associated references are available in the online version of the paper.

Accession codes. Duck genome assembly and reads have been deposited under GenBank accession PRJNA46621. Transcript sequencing data have been deposited under GenBank Gene Expression Omnibus (GEO) accession GSE22967 and Short Read Archive (SRA) accession PRJNA194464.

Note: Supplementary information is available in the online version of the paper.

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### AUTHOR CONTRIBUTIONS

N.L., J.W., Y.H. and D.W.B. organized the committee for the duck genome sequencing project. N.L., J.W., Y.H., X.H., L.R. and J.F. designed the duck genome sequence project. J.W., W.Q., Y.L. and Y. Zhang sequenced and assembled the duck genome. W.Q., Y.H., A.V. and T.F. assessed the quality of the duck genome. J.L., W.Q., S.F., Y.H., B.L., A.V., S.S., Yiqiang Zhao, Z.D., Q.C., H.T., S.B., S.K., M. Marz, M. Morisson, M.R., F.P. and P.F.S. performed gene prediction and annotation. D.W.B., H.K., Y.H., B.L., J.H., T.L., K.-W.K., J.S. and D.K.G. performed gene evolutionary analysis. Y.H., W.Q., D.W.B., Q.L., Z.D., Z.S., Y.A. and P.K. detected expansion and contraction of immune-related genes. Y.H., N.L., S.G., W.Q., Z.S. and Y.A. analyzed  $\beta$ -defensin and immunoglobulin genes. Y.H., N.L., H.C., K.Y., H.F., P.Z., D.W.B., K.E.M., R.G.W., J.R.A. and W.C.W. characterized the immune-related gene response to avian influenza viruses. Y.H. and W.Q. wrote the manuscript. N.L., Y.H., D.W.B., L.G., J.W., M.A.M.G., R.P.M.A.C., Yaofeng Zhao, R.H.S.K., A.V., K.E.M. and J.S. revised the manuscript.

#### COMPETING FINANCIAL INTERESTS

The authors declare no completing financial interests.

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### **ONLINE METHODS**

**Sequence assembly.** We constructed paired-end DNA libraries with insert size smaller and larger than 2 kb according to the manuals for the standard DNA and mate-pair libraries, respectively (Illumina). The sequencing process followed the manufacturer's recommendations. After removing duplicate reads introduced by PCR, base calling and adaptor sequence contained in the raw reads, we assembled the duck genome with SOAPdenovo<sup>14</sup>.

**Gene evolution.** We created a reference gene set by merging the homology set, the *de novo* set and the GLEAN set. We built gene families using the Ensembl pipeline<sup>41</sup> with genomes in Ensembl59 in addition to the duck and turkey genomes, and we subsequently estimated the change of gene complements using the CAFÉ (computational analysis of gene family evolution) tool<sup>21</sup>. We predicted the positively selected genes using the codeml program under the branch-site model<sup>29</sup>. We constructed maximum-likelihood trees with protein sequences using PHYML version 2.4.4 under the JTT model with four substitution rate classes<sup>42</sup>.

**Facility.** Studies of the H5N1 viruses (DK/49 and GS/65) were conducted in a biosecurity level 3+ laboratory that was approved by the Chinese Ministry of Agriculture. All animal studies were approved by the Review Board of the Harbin Veterinary Research Institute, Chinese Academy of Agriculture Sciences.

**Viruses, duck infection and RNA extraction.** The DK/49 and GS/65 H5N1 viruses were isolated from a duck and a goose, respectively, during the avian influenza outbreak of 2005 in China<sup>43</sup>. The viruses were propagated in 10-d-old fertilized chicken eggs. Two groups of 4-week-old specific pathogen-free (SPF) Shaoxin ducks from the Harbin Veterinary Research Institute, China Academy of Agricultural Science, were inoculated intranasally with 10<sup>3</sup> of 50% egg infectious doses (EID50) of the DK/49 and GS/65 viruses after adapted to a biosecurity level 3+ environment for 4 d. The lungs were collected from the above H5N1 virus–infected ducks at days 1, 2 and 3 after inoculation and from uninfected 4-week-old SPF ducks (*n* = 3, except *n* = 2 for the GS/65-infected ducks 2 d after inoculation, and *n* = 1 for the DK/49-infected ducks 3 d after inoculation).

Total RNA was extracted from approximately 100 mg of each lung tissue sample using the Qiagen RNeasy kit. RNA concentration and quality were measured using an Agilent 2100 Bioanalyzer, showing that all RNA samples had an RNA integrity number (RIN) of >7.3 and a ratio of 28S:18S rRNA of >1.0. Subsequently, each pooled lung RNA sample for DK/49-infected ducks 1–2 d after inoculation, GS/65-infected ducks 1–3 d after inoculation and control ducks was separately prepared from equal masses of two or three individuals.

RNA sequencing. cDNA libraries were prepared according to the manufacturer's instructions (Illumina). One mRNA sample of the lung collected from a duck infected with the DK/49 virus 3 d after inoculation and six pooled lung RNA samples were purified from total RNA using Dynal Oligo(dT) beads and fragmented into small pieces of approximately 200 nt using RNA Fragmentation Reagents (Ambion). Cleaved mRNA fragments were reverse transcribed into single cDNAs using SuperScript II (Invitrogen) and were primed with random primers; double-stranded cDNA was then synthesized using RNase H (Invitrogen) and DNA Pol I (Invitrogen). Subsequently, cDNA was subjected to end repair and phosphorylation using Klenow polymerase (Enzymatics), T4 DNA polymerase (Enzymatics) and T4 polynucleotide kinase (to blunt end the DNA fragments) (Enzymatics). End-repaired cDNA fragments were 3' adenylated using Klenow (exo-) DNA polymerase (Enzymatics). Then, Illumina paired-end adapters were ligated to the ends of these 3'-adenylated cDNA fragments. Gel electrophoresis was used to separate the cDNA fragments from any unligated adapters. cDNA fragments from 180-220 bp in size were selected. cDNA libraries were amplified using 12 cycles of PCR with Phusion polymerase (NEB), and 75-cycle paired-end sequencing was performed on the Illumina Genome Analyzer.

**Transcriptome analysis.** We clustered the BGI and Ensembl reference gene sets (**Supplementary Note**) and the duck transcripts deposited in the NCBI database to create a merged reference gene set consisting of 20,647 protein-coding genes. We aligned the high-quality reads to the genome and the merged reference gene set using SOAPaligner with a threshold of five mismatches. For multiposition hits, one of the best matching loci was chosen randomly. Only uniquely mapped reads were used for the analysis of gene expression levels. Differentially expressed genes were identified using Fisher's exact test<sup>44</sup> and Bonferroni-Hochberg correction (FDR  $\leq 0.001$ , fold change  $\geq 2$ )<sup>45</sup>. Differentially expressed genes identified in DK/49- or GS/65-infected ducks compared with control ducks were merged to create sets 1 and 2. Differentially expressed genes identified in DK/49- infected ducks compared with GS/65-infected ducks were combined into set 3 (**Table 1**). The three sets of differentially expressed genes were used to investigate biological processes using IPA.

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