

Citation: Wang H, Wang C, Yang K, Liu J, Zhang Y, Wang Y, et al. (2015) Genome Wide Distributions and Functional Characterization of Copy Number Variations between Chinese and Western Pigs. PLoS ONE 10(7): e0131522. doi:10.1371/journal. pone.0131522

Editor: Jian-Feng Liu, China Agricultural Univeristy, CHINA

Received: March 29, 2015

Accepted: June 3, 2015

Published: July 8, 2015

Copyright: © 2015 Wang et al. This is an open access article distributed under the terms of the <u>Creative Commons Attribution License</u>, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: All relevant data are within the paper and its Supporting Information files.

Funding: This work was supported by the Major International Cooperation NSFC (31210103917) (http://www.nsfc.gov.cn/) and the National High Technology Research and Development Program of China (2011AA100304, 2013AA102502) (http:// program.most.gov.cn/). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. **RESEARCH ARTICLE**

Genome Wide Distributions and Functional Characterization of Copy Number Variations between Chinese and Western Pigs

Hongyang Wang^{1,2}, Chao Wang^{1,2}, Kui Yang³, Jing Liu^{1,2}, Yu Zhang^{1,2}, Yanan Wang^{1,2}, Xuewen Xu^{1,2}, Jennifer J. Michal⁴, Zhihua Jiang^{1,4}, Bang Liu^{1,2}*

1 Key Laboratory of Agricultural Animal Genetics, Breeding and Reproduction of Ministry of Education, Huazhong Agricultural University, Wuhan, PR China, **2** The Cooperative Innovation Center for Sustainable Pig Production, Huazhong Agricultural University, Wuhan, PR China, **3** Modern Educational & Technology Centre of Huazhong Agricultural University, Wuhan, PR China, **4** Department of Animal Sciences, Washington State University, Pullman, WA, United States of America

* liubang@mail.hzau.edu.cn

Abstract

Copy number variations (CNVs) refer to large insertions, deletions and duplications in the genomic structure ranging from one thousand to several million bases in size. Since the development of next generation sequencing technology, several methods have been well built for detection of copy number variations with high credibility and accuracy. Evidence has shown that CNV occurring in gene region could lead to phenotypic changes due to the alteration in gene structure and dosage. However, it still remains unexplored whether CNVs underlie the phenotypic differences between Chinese and Western domestic pigs. Based on the read-depth methods, we investigated copy number variations using 49 individuals derived from both Chinese and Western pig breeds. A total of 3,131 copy number variation regions (CNVRs) were identified with an average size of 13.4 Kb in all individuals during domestication, harboring 1,363 genes. Among them, 129 and 147 CNVRs were Chinese and Western pig specific, respectively. Gene functional enrichments revealed that these CNVRs contribute to strong disease resistance and high prolificacy in Chinese domestic pigs, but strong muscle tissue development in Western domestic pigs. This finding is strongly consistent with the morphologic characteristics of Chinese and Western pigs, indicating that these group-specific CNVRs might have been preserved by artificial selection for the favored phenotypes during independent domestication of Chinese and Western pigs. In this study, we built high-resolution CNV maps in several domestic pig breeds and discovered the group specific CNVs by comparing Chinese and Western pigs, which could provide new insight into genomic variations during pigs' independent domestication, and facilitate further functional studies of CNV-associated genes.



Competing Interests: The authors have declared that no competing interests exist.

Introduction

Genomic structural variations due to large insertions, deletions, inversions and translocations are called copy number variations (CNVs). The genome region CNV happened is defined CNV region (CNVR), which can range in size from one Kb to several Mb and occur with high frequency in genomes [1]. Until now, CNVs have been detected in humans [2–4], mice [5, 6], dogs [7, 8], pigs [9–12], cattle [13–15] and chickens [16, 17].

Copy number variations have been linked to many diseases, disorders, and phenotypic traits. In humans a set of CNVs was present in 189 subjects diagnosed with major depressive disorder who previously attempted suicide compared to 1,073 subjects with major depressive disorder but never attempted suicide [18], while Liu et al. [19] found that a deletion at 2p24.3 was significantly associated with prostate cancer risk in 498 aggressive prostate cancer cases using affymetrix SNP arrays. In addition, the effect of CNVs on body mass index and earlyonset extreme obesity has been reported [20, 21]. In livestock animals, four types of duplications at the KIT locus were exclusively present in the dominant white allele, which caused white or white-spotted coat colours in pigs [22]. Another KIT gene related study performed a database of 50K SNP genotypes from 4,500 cattle revealed that colour sidedness was determined by translocation events between chromosomes 6 and 29 [23]. Recently, Xu et al. found that 34 CNVs on 22 chromosomes were associated with several milk production using 26,362 Holstein bulls and cows [24]. Furthermore, a 4.6 Kb duplication in intron 6 of the STX17 gene leads to the greying with age phenotype in horses [25]. Disruption of the CCDC108 gene by structural rearrangement causes a sperm motility defect in male chickens homozygous for rose-comb phenotype, while a CNV in intron 1 of SOX5 causes the pea-comb phenotype in chickens [16, 26].

Single nucleotide polymorphism (SNP) chips and comparative genomic hybridization (CGH) arrays have served as useful tools to detect CNVs in the past [27–29]. Certainly, their limitations include low probe density and cross-hybridization of repetitive sequences, which can lead to a high number of false-positive results in CNV detection [15]. However, evidence has clearly shown that next generation sequencing (NGS) technology can significantly benefit discovery of CNVs [11, 15].Generally speaking, NGS strategies for CNV detection have mainly relied on read-depth (RD) and paired-end mapping (PEM) approaches. The PEM method is only applicable to paired-end reads [30]. Moreover, the PEM approach is suitable for detecting CNVs in regions of low complexity [31]. In contrast, RD methods depend on the depth of coverage in the genomic region to estimate the CNV value. RD methods can detect large insertions and CNVs in complex genomic regions [32].

In the present study, we focused on discovery of group-specific CNVs and their associated genes that affect disease resistance, reproduction and growth rate in domestic Chinese and Western pigs by using NGS data from 49 individuals from Chinese and Western breeds [33–35]. Here we report novel CNVs generated during the domestication of pigs. Some of the CNVs were specific to either Chinese or Western breeds, which might due to the independent domestication and trait selection differences between Chinese and Western pigs. In particular, the CNV-associated genes in the Chinese breeds were involved in the inflammatory response and reproduction, whereas, CNV-associated genes in the Western domestic pigs were related to muscle tissue development. The novel CNV information from this research is expected to enrich the data of porcine genome variations and facilitate further research on the differences between Chinese and Western domestic pig.

Materials and Methods

Data collection and sequence alignment

The whole genome sequencing data from 13 populations of *Sus scrofa* containing a total of 49 individuals were obtained as previously described [33-35], and all sequencing data were generated using the Illumina HiSeq platform. The libraries were 100 bp pair-end reads and the insert sizes ranged from 300–500 bp. The samples included one European wild boar (Netherlands), one Chinese wild boar (South China), twenty five Western domestic pigs from four commercial breeds and twenty two Chinese domestic pigs of seven breeds from South China (Table A in <u>S1 File</u>).

Before sequence alignment, repeat regions in the porcine genome (*Sus scrofa* build 10.2) were masked using RepeatMasker [36] (RepeatMasker-open-4-0-3, RMBlast as the search engine and repeatmasker libraries-20130422 as the library,-s option). Additionally, masked regions were extended 100 bp in both directions to avoid boundary alignment effects [15, 37]. Mapping of the reads to the masked porcine genome was performed with Bowtie2 (-x -1- 2-S-D 15-R 2-N 0-L 22 -i S,1,1.15). Approximately 49% of the genome was masked and 50% of the raw reads were mapped to the unmasked portion of the genome. Subsequently, the SAM file was converted to the BAM file, sorted and indexed using Samtools [38]. Finally, the BAM files were strictly filtered using a high mapping quality value (\geq 42) to reduce spurious alignment (Table A in <u>S1 File</u>).

Identification of pig CNVs

The CNVs in all individuals were identified using CNV-seq [39] and CNVnator [40] based on the RD method. Reads were counted using a sliding window approach and used to find CNVs. The CNV-seq was run under a robust statistical model and the CNVs were evaluated by comparing the test samples to the reference samples (wild boars) [39]. Therefore, the results from the CNV-seq analysis represented the CNVs generated from wild boars to domestic pigs during domestication. Window size was about 10 Kb in this process. The range of discovered CNVs was broadened by CNVnator based on the combination of the established mean-shift approach with additional refinements (multiple-bandwidth partitioning and GC correction) to span 300 bp along the whole genome of each individual [40]. Credible CNVRs between 1 Kb to 100 Kb identified by CNVseq and CNVnator were selected and combined for each individual. For analyzing CNV differences between Chinese and Western breeds, all the CNVRs from Chinese domestic pigs and Western domestic pigs were combined into two groups to represent their respective CNVs during domestication.

Experiment validation

Primers were designed using the Primer 5.0 tool so the expected amplicon lengths were restricted between 100 and 300 bp and the GC percentages were between 40% and 60%. Primers were further tested for unique binding sites by Primer-BLAST [41]. Primer amplification efficiencies were determined by testing them on a standard curve of DNA over 5 logs of concentration (Table A in <u>S2 File</u>). qPCR were performed using 25 ng of pig genomic DNA as template in a final volume of 10 ul containing 5 ul SYBR Green Realtime PCR Master Mix (TOYOBO), 3.6 ul ddH2O and 15 ng of each primer. All reactions were amplified on CFX384 Real-Time System (BioRad) in triplicate. The CN values in the test loci were calculated as $(1+e)^{(1-ddCt)}$. The porcine glucagon gene (*GCG*) was included as the single copy control gene [9, 12]. To reduce batch and platform effects, plates were designed to amplify the reference gene and the same sample in each experiment.

Gene content and Gene Ontology in CNVRs

The genes located in CNVRs were assessed using BioMart [42] according to Ensembl. The CNVRs and gene regions containing start and end sites of exons and introns were compared to find the CNV effects on amino acids or introns for each gene. The DAVID web tool [43, 44] and Blast2go [45] were used to identify genes in the porcine CNVRs that were homologous to human genes and to classify the genes in terms of molecular function, cell component, biological process, and pathway. All the data were considered to be statistically significant at P<0.05.

Results and Discussion

Detection of CNVRs in domestic pigs

CNV-seq [39] and CNVnator [40] were used for CNVs detection among 49 individual pigs. The combination of these two methods discovered 3,131 CNVRs based on the RD information of domestic individuals in comparison to a wild boar (one Chinese and one Western) (Table B in <u>S1 File</u>). The CNVRs occupied a total of 42.1 Mb or 1.72% of the pig genome (Fig 1; Table C in <u>S1 File</u>). The size of the CNVRs varied from 1 to 88.8 Kb, and averaged 13.4 Kb. Among the 3,131 CNVRs, 745 gained CN, 2,364 lost CN and 22 show both CN gain and loss within the same regions from different individuals as compared to the wild boar. In particular, loss variations accounted for 75% (2,364 loss/3,131 total) of CNVs, indicating that these variations may be related to the deletion of chromosome regions. The CNVR density varied from 0.75% on chromosome 17 to 2.40% on chromosome 2 (Table C in <u>S1 File</u>), which is consistent with a previous report by Paudel and colleagues using 16 pigs from Europe and Asia [11].

We observed that the CNVR numbers varied among the 13 breeds used in the present study. Of the Chinese pig breeds, the number of CNVRs varied from 383 (12%) in Penzhou





doi:10.1371/journal.pone.0131522.g001



Fig 2. CNVs sharing intervals and basepairs among Western breeds. In the Venn diagram, the top number indicates the count of shared CNVs, and the bottom number the CNV intervals and basepairs among three Western breeds. The table to the right of the diagram shows total CNV counts and length in each breed.

doi:10.1371/journal.pone.0131522.g002

PLOS ONE

pigs to 919 (29%) in Tongcheng pigs. With respect to Western pig breeds, 738 (24%), 677 (22%), 626 (20%) and 119 (4%) CNVRs were found in LargeWhite, Landrace, Duroc and Hampshire pigs, respectively. Interestingly enough, these breeds had only a few common CNVRs (Fig 2). These results proved that there are fewer shared CNVs among different breeds, which is consistent with Bickhart *et al.* study that greatest CNV diversities are existed among five different cattle breeds [15].

After comparing our results with CNVRs previously identified from NGS data generated by other researchers, we found only a few overlapping events across the different datasets. First, we compared our CNVRs with which were identified using SNP chips, consisting of Chinese domestic pig breeds. Chen et al. [46] used porcine SNP60 beadchip data of 18 populations and discovered 565 non-redundant CNVRs in 1,327 individuals. Only 174 CNVRs in our results were overlapped with Chen et al. study. For recently study of Dong et al. [47], they performed PennCNV to discover CNVs with SNP60 beadchip of 96 individuals from three Chinese pig breeds. Totally 105 CNVRs were found. There's also a few CNVRs overlapped with ours. We thought that low probe density of SNP chips might lead to a high number of false-positive results in CNV detection and most of Chinese breeds they used are Bamaxiang, Dongshan, Erhualian, Minzhu, Rongchang pigs et al. in Chen et al. study and Tibetan, Dahe and Wuzhishan pigs in Dong et al. study, which are different with Chinese breeds used in ours. After that, we did comparisons between our CNVRs and others used NGS data. Rubin et al. [22] identified 1,928 CNVRs from 8 pig breeds. Among them, only 28 overlapped our results. Paudel et al. used the NGS data of 16 individual pigs including European and Asian pigs and identified 3,118 CNVRs [11]. Of them, 164 regions overlapped our results. It is possible that different sample sizes and pig breeds or origins might have caused the differences in CNVRs reported by the various groups. We used a large NGS data set containing 49 individuals

collected from 13 pig breeds. In comparison, Paudel used only 16 individual pigs and most were Xiang and Jiangquhai breeds of Asian pigs. Our present study did not include any Xiang and Jiangquhai pigs. In addition, we used sequence data from individual pigs, rather than pooled sequence data used by Rubin *et al.* This comparison result was consistent with the observation by Bickhart *et al.*, who pointed out that the CNV differences were greater among breeds [15].

Genomic features of CNVRs

Previous studies showed that CNVs were formed by non-allelic homologous recombination (NAHR) associated with many repetitive elements in genome [48, 49]. These repeat elements associated with the breakpoints of CNVR are often Alu and LINE retrotransposons and microsatellites [50]. As such, we merged all CNVRs and the 10 Kb flanking regions from both sides of the region and compared these sequences with the repeat element regions using the Repeat-Masker software. Interestingly enough, the merged regions had more than twice the number of repeat elements (Table 1) than the genome wide average (Fisher test, P<0.001). The repeat elements included SINE (Alu, MIRs), LINE (L1, L2, etc.), LTR (ERVL-MaLR, ERV1, etc.) and other DNA elements. Based on these results, we speculate there is a high association between repeat elements and CNVRs. In particular, the repeat elements might promote the formation of CNVs [11, 51].

CNV validation

In the present study, we selected 28 novel CNVRs including 19 genic CNVRs and 9 non-genic CNVRs for validation using quantitative real time-polymerase chain reaction (qPCR) assays. The ddCt method was used to determine the copy number of these regions in domestic pigs relative to those of wild boars. Nearly 86% (24 confirmed/28 total) of the predicted CNVRs were confirmed by qPCR (Table A in S2 File; Fig 3; S5 File), indicating a low false discovery rate of CNV calling and a high sensitivity of our qPCR method. We also validated the predicted CNVRs on chromosome 8 containing the *KIT* gene, which is associated with the dominant white color in Western pigs [22]. We plotted the log₂ ratio CNV graph in the region using the ggplot package [39] and found a large CNV region of 43.2–43.8 Mb in LargeWhite pigs and

Table 1. D	ensity and	I number of repea	at elements in	CNVRs con	npared to	porcine genome.
------------	------------	-------------------	----------------	-----------	-----------	-----------------

Repeat element	Pig CNVRs		Porcine Genome	
	number ^a	Density ^b	number ^a	Density ^c
LINEs	43,642	11.321*	918,156	3.746
SINEs	58,738	15.237*	1,660,382	6.775
Small RNA	189	0.049	1,268,659	5.177
LTR elements	11,191	2.903*	299,047	1.220
DNA elements	9,713	2.520*	278,366	1.136
Satellites	36	0.009*	1,019	0.004
Unclassified	187	0.049*	5,394	0.022
Total	123,696	32.087*	4,431,023	18.081

^a Total counts of each repeat element in pig CNVRs and porcine genome.

^b All CNVRs and 10 Kb flanking regions in both directions of CNVRs were merged, and repeat elements were calculated at 10 Kb intervals.

^c Porcine genome was divided into 10 Kb regions and repeat elements were counted.

* P-value (< 0.001, χ2 tests)

doi:10.1371/journal.pone.0131522.t001



Fig 3. CN values predicted and observed near three gene loci. The left pictures are CN values estimated from at least 5 individuals in different breeds using the qPCR method. X axis means different pig breeds (TC = Tongcheng; MS = Meishan; NJ = Neijiang; JH = Jinhua; PZ = Penzhou; LW = LargeWhite; DU = Duroc; LR = Landrace). Y axis means the CN values. The cycles indicate CN values for each individual. The right histograms describe the predicted and observed CN values in four Tongcheng pigs. CN gain in these four gene loci was predicted.**(A) (B)**and**(C)**The left pictures showed that CN was increased in most individuals in a large range for 2–12. Also, the same trend was observed for CN gain between predicted and observed events in three Tongcheng pigs according to the right histograms.

doi:10.1371/journal.pone.0131522.g003

two CNV regions of 43.3–43.4 Mb and 43.6–43.8 Mb in Hampshire pigs, respectively (S4A File). To confirm the CNVRs in LargeWhite, Landrace, and Duroc individuals, two distinct primer sets were designed for the qPCR test. Both LargeWhite and Landrace pigs showed a CN gain from 3 to 11 copies in the 43.2–43.8 Mb region and 6 to 21 copies in the 43.3–43.4 Mb region, but no CN variation appeared in Duroc individuals within these two regions (S4B File). The CNVRs found in LargeWhite and Hampshire pigs were located in the DUP1 and DUP3/4 regions, respectively, which have also been reported previously [22]. Despite the differences in the methods and materials we used, we found the same results in the *KIT* region previously reported by others [22]. Furthermore, the validation of the CNVs detected in the *KIT* gene region indicated the credibility of our CNV prediction and qPCR verification methods.

CNV-associated genes

Among the 3,131 CNVRs described above, 1,243 CNVRs (40%) harbored a total of 1,363 genes according to the *Sus scrofa* build 10.2 assembly and Ensembl (release 76), including 1,266 protein-coding genes, 6 pseudogenes, 25 miRNA, 3 miscRNA, 4 rRNA, 18 snRNA, 12 snoRNA and 4 processed transcripts. Among the 1,243 CNVRs, 222 (18%) completely encompassed 333 genes, 484 (39%) partly overlapped with 531 genes, and 671 (54%) were located in 559 genes. Also, we found 865 CNVRs (70%) and 378 CNVRs (30%) involved in 1,079 gene exons and 320 gene introns, respectively (Table B in S2 File). Among the 1,363 genes, 899 were completely orthologous with humans according to the human orthologs of porcine genes. Gene ontology analysis indicated that CNVRs harbored genes were mainly involved in biological adhesion, GTPase regulator activity, amino acid phosphorylation, cell junction, plasma membrane part and MAPK signaling pathway (p-value < 0.05) in terms of the molecular function, cell component, biological process and pathway enrichment (Table C in S2 File).

Many genes were also found to be involved in olfaction, immunity, and lipid metabolism according to the Ensembl annotation and a previous report [52], which was consistent with the observation that olfactory and immune gene families are two large gene families associated with CNVs [11, 15] (Tables B, D and E in S2 File). Based on human orthologous genes obtained from the Online Mendelian Inheritance in Man (OMIM) database, 198 (6%) of the 3,131 CNVRs identified in the present study are associated with human orthologous OMIM genes involved in immunodeficiency, muscular dystrophy, and lipase deficiency (Table B in S1 File). These CNVRs might contribute to diseases, which need to be further validated in the future.

Functional features of CNVR associated genes in Chinese and Western pig breeds

Diversification of artificial selection during independent domestication contributes to the characteristic differences between Asian and European pigs [33, 53]. In our study, 2,278 CNVRs (567 duplications, 1706 deletions and 5 both) and 1,547 CNVRs (315 duplications and 1223 deletions and 9 both) were found in Chinese and Western breeds, with a total CNV size of 28.9 Mb and 19.8 Mb, respectively (Tables A and B in <u>S3 File</u>). Among all the CNVRs, 618 were present in both Chinese and Western domestic pigs (Table C in <u>S3 File</u>), and the remaining CNVRs were specific to either Chinese or Western breeds. These results showed that CNVs reflected Eastern and Western origins of the domestic pigs. Considering CNV inconsistency among different breeds, we selected those shared by at least four Chinese breeds and two Western breeds (\geq 50% of total breeds), and constructed two group CNV comparisons between Chinese and Western breeds. Totally, 315 and 333 CNVs were detected in Chinese and Western breeds, respectively (<u>Table 2</u>). Among these CNVs, 186 were shared, but 129 and 147 were unique to either Chinese or Western breeds, respectively (Tables D and E in S3 File).

We found that the Chinese and Western origin specific CNVRs harbor a total of 59 and 96 protein-coding genes, respectively (Tables D and E in <u>S3 File</u>). Gene ontology analysis showed that the CNVRs harbored genes in the Chinese breeds are mainly involved in inflammatory response and reproduction (Table F in <u>S3 File</u>). Selective sweep analysis also indicated that high litter size and male reproductive traits were selected in Chinese domestic breeds during domestication [<u>33</u>]. In contrast, an enrichment of genes involved in the regulation of muscle tissue, cell, and neuron development was only present in Western domestic pigs (Table F in <u>S3 File</u>).

We also found that some interesting origin specific CNVRs harbored genes. One such example is the poliovirus receptor-related gene PVRL3, also known as NECTIN-3, which is located on chromosome 13 (158,524,401-158,603,720). A 8 Kb region nearby this gene had a high CN (5~9 copies) in Chinese domestic pigs (7 breeds and 15 individuals), but no CN variation was found in Western pigs (Fig 4A). This gene has 4 transcript variants and encodes the cell adhesion protein Nectin 3. We predicted that the CNVR affected different exons and introns in the four transcripts of this gene (Fig 4A). A chromosomal translocation upstream of the PVRL3 gene significantly affects Nectin 3 expression and leads to congenital ocular defects in humans [54]. In addition, PVRL3 as an immune gene plays an important role in the Nectin-Wave pathway and is important in cell-cell adhesion according to the gene ontology analysis. The over-expression of PVRL3 gene could significantly inhibit tumour growth [55]. If CN gain existed in PVRL3 gene and promoted the gene expression, Chinese domestic pigs might be more resistant to some diseases. Another CNVR was a 6 Kb region on chromosome 14 from 126,295,501 to 126,301,500 bp. This region had the highest CN gain, almost 13 copies in some Chinese domestic pigs, but no CN gain in Western domestic pigs. There was no gene annotated in this region (Fig 4B).

Additionally, the genomic region on chromosome 12 (1,496,701–1,546,473), which harbors the *BAI1*-associated protein 2 (*BAIAP2*) and apoptosis-associated tyrosine kinase (*AATK*) genes, was found to have a high CN gain in Western domestic pigs, but not in Chinese domestic pigs (Fig 4C). The most interesting function for *BAIAP2* gene, also named *IRSP53*, is that its over-expression induced filopodia formation, decreased cell adhesion and inhibited myogenic differentiation in C2C12 cells [56]. However, mutations in the conserved IMD domain of BAIAP2 abolished the inhibition of myoblast differentiation and increased the development of myotubes [56]. Moreover, many genes that promote myoblast differentiation had higher levels of expression in Landrace compared to Tongcheng pigs [57]. Thus, we predict that the CNV in the last 11 exons of *BAIAP2* gene might change the IMD domain and promote fusion of

rable z. Distribution of shared on visit of incoc and western pig groups
--

Number of Breed(s)	CNV numbers			
	Chinese population	Western population		
≥1	2,278	1,547		
≥ 2	964	469		
\geq 3	530	133		
\geq 4	315	5		
\geq 5	166	—		
\geq 6	89	—		
≥ 7	27	—		

doi:10.1371/journal.pone.0131522.t002





Fig 4. Heatmap analysis of CNV genes between Chinese and Western domestic pigs. The heatmap boxes show the sliding and nonoverlapping windows, 1 Kb in (A) and (B) and 2 Kb in (C). CN values were plotted within these three regions and correspond to the different colors. On the top of the heatmap is the information of genes affected by CNVs. (A) A region of nearly 8 Kb (chr13: 158,547,001–158,554,500) in *PVRL3* gene had higher CN (from 5 to 9 copies), especially in Chinese domestic pigs (15 individuals / 22 totals), which was not found in Western domestic pigs. The last exon of three transcripts and the fourth intron of one transcript of this gene were affected by this CNVR. (B) A 6 Kb region at chromosome 14 from 126,295,501 to 126,301,500 bp had a higher CN in Chinese domestic pigs, but not in Western pigs. In addition, no genes were overlapped within this region. (C) The heatmap of *AATK* and *BAIAP2* genes indicated that CN gain was present in Western domestic pigs in this region, but not in Chinese domestic pigs (chr12: 1,496,701–1,546,473).

doi:10.1371/journal.pone.0131522.g004

myoblasts to form multinucleate myotubes, and thus promote the rapid growth rate of muscle cells and muscle development in Western pigs compared with Chinese pig breeds. In addition to the *BAIAP2* gene, the *AATK* gene was also located in the CNVR, and except for the first exon, all the other exons of this gene had high CN gain (13 copies) only in Western domestic pigs. AATK inhibits cell proliferation, migration and also promotes apoptosis in melanoma cells [58].

The third interesting CNV-associated gene in 22 individuals was found in the exons of catenin alpha 1 gene (*CTNNA1*). The protein encoded by this gene is associated with cadherin and is a myogenesis inhibitor. A previous study showed that *CTNNA1* was expressed at higher levels in Lantang pigs, a China indigenous obese pig breed, than in Landrace pigs [59]. Thus, we predict that the CN loss in the last two exons of *CTNNA1* results in a loss of 141 amino acids and promotes pig muscle development by affecting gene expression in Western domestic pigs.

Fertilization associated genes, *WBP2* N-terminal like (*WBP2NL*) and zonadhesin (*ZAN*), were located within CNVRs identified in Chinese domestic pigs, but not in Western domestic pigs. WBP2NL promotes meiotic resumption and pronucleus formation and is involved in fertilization in humans, mice and bulls [60]. Tardif *et al.* concluded that ZAN is important for sperm-zona pellucida adhesion, which is one of the essential steps of fertilization [61]. Gene ontology analysis of CNV-associated genes revealed an enrichment of fertilization in Chinese pigs compared to Western pigs, which was consistent with the higher litter size observed in Chinese domestic pigs (Table F in <u>S3 File</u>).

The high CNV differences between Chinese and Western breeds can be attributed to three potential reasons. Firstly, the history of domestication from wild boar to Chinese or Western domestic pigs was different. European and Asian wild boars were derived from the wild pigs originating in Southeast Asia and the phylogenetic split occurred between them during the mid-Pleistocene epoch 1.6–0.8 Myr ago [34]. Subsequently, domestication occurred independently in Western and Chinese breeds with different climates, geographical positions, and human hunting, which contributed to great diversities between them [33, 53, 62]. Secondly, different traits were selected in Chinese and Western breeds. With the long term artificial selection for reproduction, growth and disease resistance, the beneficial CNVs were conserved during domestication. For example, CNV-associated muscle development and growth rate for Western breeds might be preserved during domestication and long-term selection, and CNVs involved in resistance and tolerance of some diseases were maintained in Chinese breeds. Thirdly, the selection of Western breeds for commercialization gradually led to purification and decreased individual variation [12]. Conversely, a large population size and diverse origin occurred in Chinese pigs [34], which might have led to higher CNV counts and length in Chinese breeds than in Western breeds according to our results. Accordingly, we speculated that the CNVs were variable in Chinese and Western domestic pigs because of independent domestication, resulting in some different traits among them. The unique CNVs found in our results might contribute to disease resistance of Chinese domestic pigs and fast growth of Western domestic pigs, and facilitate our understanding of the trait differences between Chinese and Western domestic pigs during domestication.

Conclusions

In this study, we used next generation sequencing data to detect CNVRs in the porcine genome using 49 pigs, representing a large population for CNVRs scanning. CNVseq, CNVnator and other strict standards were used to enhance the credibility of the results. A large number of novel CNVRs and associated genes involved in immunity, olfaction and growth for pigs were identified. Different CNVs between Chinese and Western breeds were analyzed, and 129 and

147 CNVs were found to exist only in Chinese and Western breeds, respectively. Gene function analysis in the CNVRs revealed that an enrichment of inflammatory response and fertilization exist only in Chinese domestic pigs, and an enrichment of muscle tissue, cell, and neuron is specific to Western domestic pigs. We also found some CNV-associated genes were involved in immunity, fertilization and muscle development, such as *PVRL3*, *AATK*, *BAIAP2*, *WBP2NL*, *ZAN* and *CTNNA1* genes, which might lead to the observed phenotypic differences between Chinese and Western breeds. The data from the extensive analysis of CNVs provide some genetic markers and valuable insights for further research of Chinese and Western pig breeds during domestication.

Supporting Information

S1 File. Supporting tables. Table A, Information of samples used in our analysis. Table B, Information of identified CNVRs in 47 individuals. Table C, Densities of CNVRs in each autosome.

(XLSX)

S2 File. Supporting tables. Table A, Information of the primers used in qPCR analysis of the 28 CNVRs chosen to for validation. Table B, Exons and introns of genes affected by the identified CNVRs. Table C, Gene Ontology analysis of genes in identified CNVRs. Table D, CNV associated genes involved Olfactory. Table E, CNV associated genes involved Immune. (XLSX)

S3 File. Supporting tables. Table A, CNVRs found in Chinese domestic pigs. Table B, CNVRs found in Western domestic pigs. Table C, Comparison of identified CNVRs between Chinese and Western domestic pigs. Table D, CNVRs and associated genes unique to Chinese domestic pigs. Table E, CNVRs and associated genes unique to Western domestic pigs. Table F, Gene ontology analysis of CNV-associated genes in Chinese and Western breeds, respectively. (XLSX)

S4 File. Supporting Figure. CNVRs near *KIT* gene locus. The *KIT* gene region associated with high CN leads to the dominant white color in Western pigs. (**A**) The Log2 Ratio CNV graph near the *KIT* gene region in Hampshire and LargeWhite pigs was generated by the ggplot package. Red plots indicate the value of log2 (reads count of test/reads count of reference) in each window. CN gain was found in a large CNV region of 43.2–43.8 Mb in LargeWhite pigs and two CNV regions of 43.3–43.4 Mb and 43.6–43.8 Mb in Hampshire pigs. (**B**) CN values were estimated using the qPCR method in two regions near the *KIT* gene. The different cycles indicate the CN values in different individuals from three Western breeds. LargeWhite and Landrace individuals showed CN gain ranging in size from 3 to 11 in the *KIT*_1 region and 6 to 21 in the *KIT*_2 region, but no CNV was found in Duroc individuals. (TIF)

S5 File. Supporting Figure. CN values predicted and observed near *ATL2* gene locus. The left picture indicated that there was no CN gain in this locus, which did not agree with the predicted CN in our result. However, the predicted and observed CN was similar in Tongcheng four pigs in right picture.

(TIF)

Author Contributions

Conceived and designed the experiments: BL HYW CW ZHJ XWX. Performed the experiments: JL YZ YNW. Analyzed the data: HYW CW YZ. Contributed reagents/materials/analysis tools: KY ZHJ. Wrote the paper: BL HYW JJM.

References

- Orozco LD, Cokus SJ, Ghazalpour A, Ingram-Drake L, Wang S, van Nas A, et al. Copy number variation influences gene expression and metabolic traits in mice. Hum Mol Genet. 2009; 18(21):4118– 4129. doi: 10.1093/hmg/ddp360 PMID: 19648292
- 2. Iafrate AJ, Feuk L, Rivera MN, Listewnik ML, Donahoe PK, Qi Y, et al. Detection of large-scale variation in the human genome. Nat Genet. 2004; 36(9):949–951. PMID: <u>15286789</u>
- Sebat J, Lakshmi B, Troge J, Alexander J, Young J, Lundin P, et al. Large-scale copy number polymorphism in the human genome. Science. 2004; 305(5683):525–528. PMID: <u>15273396</u>
- Redon R, Ishikawa S, Fitch KR, Feuk L, Perry GH, Andrews TD, et al. Global variation in copy number in the human genome. Nature. 2006; 444(7118):444–454. PMID: <u>17122850</u>
- Li J, Jiang T, Mao JH, Balmain A, Peterson L, Harris C, et al. Genomic segmental polymorphisms in inbred mouse strains. Nat Genet. 2004; 36(9):952–954. PMID: <u>15322544</u>
- Snijders AM, Nowak NJ, Huey B, Fridlyand J, Law S, Conroy J, et al. Mapping segmental and sequence variations among laboratory mice using BAC array CGH. Genome Res. 2005; 15(2):302–311. PMID: <u>15687294</u>
- Chen WK, Swartz JD, Rush LJ, Alvarez CE. Mapping DNA structural variation in dogs. Genome Res. 2009; 19(3):500–509. doi: <u>10.1101/gr.083741.108</u> PMID: <u>19015322</u>
- Nicholas TJ, Cheng Z, Ventura M, Mealey K, Eichler EE, Akey JM. The genomic architecture of segmental duplications and associated copy number variants in dogs. Genome Res. 2009; 19(3):491–499. doi: 10.1101/gr.084715.108 PMID: 19129542
- Ramayo-Caldas Y, Castello A, Pena RN, Alves E, Mercade A, Souza CA, et al. Copy number variation in the porcine genome inferred from a 60 k SNP BeadChip. BMC Genomics. 2010; 11:593. doi: <u>10.</u> <u>1186/1471-2164-11-593</u> PMID: <u>20969757</u>
- Li Y, Mei S, Zhang X, Peng X, Liu G, Tao H, et al. Identification of genome-wide copy number variations among diverse pig breeds by array CGH. BMC Genomics. 2012; 13:725. doi: <u>10.1186/1471-2164-13-725</u> PMID: <u>23265576</u>
- Paudel Y, Madsen O, Megens HJ, Frantz LA, Bosse M, Bastiaansen JW, et al. Evolutionary dynamics of copy number variation in pig genomes in the context of adaptation and domestication. BMC Genomics. 2013; 14:449. doi: 10.1186/1471-2164-14-449 PMID: 23829399
- Wang Y, Tang Z, Sun Y, Wang H, Wang C, Yu S, et al. Analysis of genome-wide copy number variations in chinese indigenous and Western pig breeds by 60 k SNP genotyping arrays. PLoS One. 2014; 9(9):e106780. doi: <u>10.1371/journal.pone.0106780</u> PMID: <u>25198154</u>
- Liu GE, Hou Y, Zhu B, Cardone MF, Jiang L, Cellamare A, et al. Analysis of copy number variations among diverse cattle breeds. Genome Res. 2010; 20(5):693–703. doi: <u>10.1101/gr.105403.110</u> PMID: <u>20212021</u>
- Bae JS, Cheong HS, Kim LH, NamGung S, Park TJ, Chun JY, et al. Identification of copy number variations and common deletion polymorphisms in cattle. BMC Genomics. 2010; 11:232. doi: <u>10.1186/1471-</u> <u>2164-11-232</u> PMID: <u>20377913</u>
- Bickhart DM, Hou Y, Schroeder SG, Alkan C, Cardone MF, Matukumalli LK, et al. Copy number variation of individual cattle genomes using next-generation sequencing. Genome Res. 2012; 22(4):778– 790. doi: 10.1101/gr.133967.111 PMID: 22300768
- Wright D, Boije H, Meadows JR, Bed'hom B, Gourichon D, Vieaud A, et al. Copy number variation in intron 1 of SOX5 causes the Pea-comb phenotype in chickens. PLoS Genet. 2009; 5(6):e1000512. doi: <u>10.1371/journal.pgen.1000512</u> PMID: <u>19521496</u>
- Jia X, Chen S, Zhou H, Li D, Liu W, Yang N. Copy number variations identified in the chicken using a 60K SNP BeadChip. Anim Genet. 2013; 44(3):276–284. doi: <u>10.1111/age.12009</u> PMID: <u>23173786</u>
- Perlis RH, Ruderfer D, Hamilton SP, Ernst C. Copy number variation in subjects with major depressive disorder who attempted suicide. PLoS One. 2012; 7(9):e46315. doi: <u>10.1371/journal.pone.0046315</u> PMID: <u>23029476</u>
- Liu W, Sun J, Li G, Zhu Y, Zhang S, Kim ST, et al. Association of a germ-line copy number variation at 2p24.3 and risk for aggressive prostate cancer. Cancer Res. 2009; 69(6):2176–2179. doi: <u>10.1158/</u> 0008-5472.CAN-08-3151 PMID: <u>19258504</u>
- 20. Sha BY, Yang TL, Zhao LJ, Chen XD, Guo Y, Chen Y, et al. Genome-wide association study suggested copy number variation may be associated with body mass index in the Chinese population. J Hum Genet. 2009; 54(4):199–202. doi: 10.1038/jhg.2009.10 PMID: 19229253
- Jarick I, Vogel CI, Scherag S, Schafer H, Hebebrand J, Hinney A, et al. Novel common copy number variation for early onset extreme obesity on chromosome 11q11 identified by a genome-wide analysis. Hum Mol Genet. 2011; 20(4):840–852. doi: <u>10.1093/hmg/ddq518</u> PMID: <u>21131291</u>

- 22. Rubin CJ, Megens HJ, Martinez Barrio A, Maqbool K, Sayyab S, Schwochow D, et al. Strong signatures of selection in the domestic pig genome. Proc Natl Acad Sci U S A. 2012; 109(48):19529–19536. doi: 10.1073/pnas.1217149109 PMID: 23151514
- Durkin K, Coppieters W, Drogemuller C, Ahariz N, Cambisano N, Druet T, et al. Serial translocation by means of circular intermediates underlies colour sidedness in cattle. Nature. 2012; 482(7383):81–84. doi: 10.1038/nature10757 PMID: 22297974
- Xu L, Cole JB, Bickhart DM, Hou Y, Song J, VanRaden PM, et al. Genome wide CNV analysis reveals additional variants associated with milk production traits in Holsteins. BMC Genomics. 2014; 15(1):683.
- Sundstrom E, Imsland F, Mikko S, Wade C, Sigurdsson S, Pielberg GR, et al. Copy number expansion of the STX17 duplication in melanoma tissue from Grey horses. BMC Genomics. 2012; 13:365. doi: <u>10.</u> <u>1186/1471-2164-13-365</u> PMID: <u>22857264</u>
- 26. Imsland F, Feng C, Boije H, Bed'hom B, Fillon V, Dorshorst B, et al. The Rose-comb mutation in chickens constitutes a structural rearrangement causing both altered comb morphology and defective sperm motility. PLoS Genet. 2012; 8(6):e1002775. doi: 10.1371/journal.pgen.1002775 PMID: 22761584
- Peiffer DA, Le JM, Steemers FJ, Chang W, Jenniges T, Garcia F, et al. High-resolution genomic profiling of chromosomal aberrations using Infinium whole-genome genotyping. Genome Res. 2006; 16 (9):1136–1148. PMID: <u>16899659</u>
- Winchester L, Yau C, Ragoussis J. Comparing CNV detection methods for SNP arrays. Brief Funct Genomic Proteomic. 2009; 8(5):353–366. doi: <u>10.1093/bfgp/elp017</u> PMID: <u>19737800</u>
- Pinto D, Darvishi K, Shi X, Rajan D, Rigler D, Fitzgerald T, et al. Comprehensive assessment of arraybased platforms and calling algorithms for detection of copy number variants. Nat Biotechnol. 2011; 29 (6):512–520. doi: 10.1038/nbt.1852 PMID: 21552272
- Korbel JO, Urban AE, Affourtit JP, Godwin B, Grubert F, Simons JF, et al. Paired-end mapping reveals extensive structural variation in the human genome. Science. 2007; 318(5849):420–426. PMID: 17901297
- Zhao M, Wang Q, Jia P, Zhao Z. Computational tools for copy number variation (CNV) detection using next-generation sequencing data: features and perspectives. BMC Bioinformatics. 2013; 14 Suppl 11: S1.
- Yoon S, Xuan Z, Makarov V, Ye K, Sebat J. Sensitive and accurate detection of copy number variants using read depth of coverage. Genome Res. 2009; 19(9):1586–1592. doi: <u>10.1101/gr.092981.109</u> PMID: <u>19657104</u>
- Wang C, Wang H, Zhang Y, Tang Z, Li K, Liu B. Genome-wide analysis reveals artificial selection on coat colour and reproductive traits in Chinese domestic pigs. Mol Ecol Resour. 2014.
- Groenen MA, Archibald AL, Uenishi H, Tuggle CK, Takeuchi Y, Rothschild MF, et al. Analyses of pig genomes provide insight into porcine demography and evolution. Nature. 2012; 491(7424):393–398. doi: <u>10.1038/nature11622</u> PMID: <u>23151582</u>
- Li M, Tian S, Jin L, Zhou G, Li Y, Zhang Y, et al. Genomic analyses identify distinct patterns of selection in domesticated pigs and Tibetan wild boars. Nat Genet. 2013; 45(12):1431–1438. doi: <u>10.1038/ng.</u> <u>2811</u> PMID: <u>24162736</u>
- 36. Smit A, Hubley R, Green P. 1996. RepeatMasker Open-3.0. Available: http://www.repeatmasker.org.
- Sudmant PH, Kitzman JO, Antonacci F, Alkan C, Malig M, Tsalenko A, et al. Diversity of human copy number variation and multicopy genes. Science. 2010; 330(6004):641–646. doi: <u>10.1126/science.</u> <u>1197005</u> PMID: <u>21030649</u>
- Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, Homer N, et al. The Sequence Alignment/Map format and SAMtools. Bioinformatics. 2009; 25(16):2078–2079. doi: <u>10.1093/bioinformatics/btp352</u> PMID: <u>19505943</u>
- Xie C, Tammi MT. CNV-seq, a new method to detect copy number variation using high-throughput sequencing. BMC Bioinformatics. 2009; 10:80. doi: 10.1186/1471-2105-10-80 PMID: 19267900
- Abyzov A, Urban AE, Snyder M, Gerstein M. CNVnator: an approach to discover, genotype, and characterize typical and atypical CNVs from family and population genome sequencing. Genome Res. 2011; 21(6):974–984. doi: 10.1101/gr.114876.110 PMID: 21324876
- Ye J, Coulouris G, Zaretskaya I, Cutcutache I, Rozen S, Madden TL. Primer-BLAST: a tool to design target-specific primers for polymerase chain reaction. BMC Bioinformatics. 2012; 13:134. doi: <u>10.1186/</u> <u>1471-2105-13-134</u> PMID: <u>22708584</u>
- Guberman JM, Ai J, Arnaiz O, Baran J, Blake A, Baldock R, et al. BioMart Central Portal: an open database network for the biological community. Database (Oxford). 2011; 2011:bar041.
- Huang da W, Sherman BT, Lempicki RA. Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. Nat Protoc. 2009; 4(1):44–57. doi: <u>10.1038/nprot.2008.211</u> PMID: <u>19131956</u>

- Huang da W, Sherman BT, Lempicki RA. Bioinformatics enrichment tools: paths toward the comprehensive functional analysis of large gene lists. Nucleic Acids Res. 2009; 37(1):1–13. doi: <u>10.1093/nar/</u> <u>gkn923</u> PMID: <u>19033363</u>
- Conesa A, Gotz S, Garcia-Gomez JM, Terol J, Talon M, Robles M. Blast2GO: a universal tool for annotation, visualization and analysis in functional genomics research. Bioinformatics. 2005; 21(18):3674– 3676. PMID: 16081474
- 46. Chen C, Qiao R, Wei R, Guo Y, Ai H, Ma J, et al. A comprehensive survey of copy number variation in 18 diverse pig populations and identification of candidate copy number variable genes associated with complex traits. BMC Genomics. 2012; 13:733. doi: 10.1186/1471-2164-13-733 PMID: 23270433
- Dong K, Pu Y, Yao N, Shu G, Liu X, He X, et al. Copy number variation detection using SNP genotyping arrays in three Chinese pig breeds. Anim Genet. 2015; 46(2):101–109. doi: <u>10.1111/age.12247</u> PMID: <u>25590996</u>
- Cahan P, Li Y, Izumi M, Graubert TA. The impact of copy number variation on local gene expression in mouse hematopoietic stem and progenitor cells. Nat Genet. 2009; 41(4):430–437. doi: <u>10.1038/ng.350</u> PMID: <u>19270704</u>
- 49. Hastings PJ, Lupski JR, Rosenberg SM, Ira G. Mechanisms of change in gene copy number. Nat Rev Genet. 2009; 10(8):551–564. doi: <u>10.1038/nrg2593</u> PMID: <u>19597530</u>
- 50. Kim PM, Lam HY, Urban AE, Korbel JO, Affourtit J, Grubert F, et al. Analysis of copy number variants and segmental duplications in the human genome: Evidence for a change in the process of formation in recent evolutionary history. Genome Res. 2008; 18(12):1865–1874. doi: <u>10.1101/gr.081422.108</u> PMID: <u>18842824</u>
- Giuffra E, Tornsten A, Marklund S, Bongcam-Rudloff E, Chardon P, Kijas JM, et al. A large duplication associated with dominant white color in pigs originated by homologous recombination between LINE elements flanking KIT. Mamm Genome. 2002; 13(10):569–577. PMID: <u>12420135</u>
- Nguyen DT, Lee K, Choi H, Choi MK, Le MT, Song N, et al. The complete swine olfactory subgenome: expansion of the olfactory gene repertoire in the pig genome. BMC Genomics. 2012; 13:584. doi: <u>10.</u> <u>1186/1471-2164-13-584 PMID: 23153364</u>
- Larson G, Liu R, Zhao X, Yuan J, Fuller D, Barton L, et al. Patterns of East Asian pig domestication, migration, and turnover revealed by modern and ancient DNA. Proc Natl Acad Sci U S A. 2010; 107 (17):7686–7691. doi: <u>10.1073/pnas.0912264107</u> PMID: <u>20404179</u>
- Lachke SA, Higgins AW, Inagaki M, Saadi I, Xi Q, Long M, et al. The cell adhesion gene PVRL3 is associated with congenital ocular defects. Hum Genet. 2012; 131(2):235–250. doi: <u>10.1007/s00439-011-1064-z</u> PMID: <u>21769484</u>
- Martin TA, Lane J, Harrison GM, Jiang WG. The expression of the Nectin complex in human breast cancer and the role of Nectin-3 in the control of tight junctions during metastasis. PLoS One. 2013; 8(12): e82696. doi: 10.1371/journal.pone.0082696 PMID: 24386110
- Misra A, George B, Rajmohan R, Jain N, Wong MH, Kambadur R, et al. Insulin receptor substrate protein 53kDa (IRSp53) is a negative regulator of myogenic differentiation. Int J Biochem Cell Biol. 2012; 44(6):928–941. doi: 10.1016/j.biocel.2012.02.020 PMID: 22465711
- Tang Z, Li Y, Wan P, Li X, Zhao S, Liu B, et al. LongSAGE analysis of skeletal muscle at three prenatal stages in Tongcheng and Landrace pigs. Genome Biol. 2007; 8(6):R115. PMID: <u>17573972</u>
- Ma S, Rubin BP. Apoptosis-associated tyrosine kinase 1 inhibits growth and migration and promotes apoptosis in Lab Invest. 2014; 94(4):430–438. doi: <u>10.1038/labinvest.2014.13</u> PMID: <u>24589855</u>
- 59. Zhao X, Mo D, Li A, Gong W, Xiao S, Zhang Y, et al. Comparative analyses by sequencing of transcriptomes during skeletal muscle development between pig breeds differing in muscle growth rate and fatness. PLoS One. 2011; 6(5):e19774. doi: 10.1371/journal.pone.0019774 PMID: 21637832
- Wu AT, Sutovsky P, Manandhar G, Xu W, Katayama M, Day BN, et al. PAWP, a sperm-specific WW domain-binding protein, promotes meiotic resumption and pronuclear development during fertilization. J Biol Chem. 2007; 282(16):12164–12175. PMID: 17289678
- Tardif S, Cormier N. Role of zonadhesin during sperm-egg interaction: a species-specific acrosomal molecule with multiple functions. Mol Hum Reprod. 2011; 17(11):661–668. doi: <u>10.1093/molehr/gar039</u> PMID: <u>21602212</u>
- Larson G, Dobney K, Albarella U, Fang M, Matisoo-Smith E, Robins J, et al. Worldwide phylogeography of wild boar reveals multiple centers of pig domestication. Science. 2005; 307(5715):1618–1621. PMID: 15761152