bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Population Bottlenecks and Intra-host Evolution during Human-to-Human Transmission of SARS-CoV-2

Daxi Wang[1,3#], Yanqun Wang[2#], Wanying Sun[1,3,4#], Lu Zhang[2,5#], Jingkai Ji[1,3#], Zhaoyong Zhang[2#], Xinyi Cheng[1,3,13#], Yimin Li[2#], Fei Xiao[6], Airu Zhu[2], Bei Zhong[7], Shicong Ruan[8], Jiandong Li[1,3,4], Peidi Ren[1,3], Zhihua Ou[1,3], Minfeng Xiao[1,3], Min Li[1,3,4], Ziqing Deng[1,3], Huanzi Zhong[1,3,9], Fuqiang Li[1,3,10], Wen-jing Wang[1,10], Yongwei Zhang[1], Weijun Chen[4,11], Shida Zhu[1,12], Xun Xu[1,14], Xin Jin[1], Jingxian Zhao[2], Nanshan Zhong[2], Wenwei Zhang[1*], Jincun Zhao[2,5*], Junhua Li[1,3,13*], Yonghao Xu[2*]

[1]BGI-Shenzhen, Shenzhen, 518083, China.

[2]State Key Laboratory of Respiratory Disease, National Clinical Research Center for Respiratory Disease, Guangzhou Institute of Respiratory Health, the First Affiliated Hospital of Guangzhou Medical University, Guangzhou, Guangdong, 510120, China.

[3]Shenzhen Key Laboratory of Unknown Pathogen Identification, BGI-Shenzhen, Shenzhen, 518083, China.

[4]BGI Education Center, University of Chinese Academy of Sciences, Shenzhen, 518083, China.

[5]Institute of Infectious disease, Guangzhou Eighth People's Hospital of Guangzhou Medical University, Guangzhou, Guangdong, 510060, China.

[6]Department of Infectious Diseases, Guangdong Provincial Key Laboratory of Biomedical Imaging, Guangdong Provincial Engineering Research Center of Molecular Imaging, The Fifth Affiliated Hospital, Sun Yat-sen University, Zhuhai, Guangdong, 519000, China.

[7]The Sixth Affiliated Hospital of Guangzhou Medical University, Qingyuan People's Hospital, Qingyuan, Guangdong, China.

[8]Yangjiang People's Hospital, Yangjiang, Guangdong, China

[9]Laboratory of Genomics and Molecular Biomedicine, Department of Biology, University of Copenhagen, 2100 Copenhagen, Denmark.

[10]Guangdong Provincial Key Laboratory of Human Disease Genomics, Shenzhen Key Laboratory of Genomics, BGI-Shenzhen, Shenzhen, 518083, China.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

[11]BGI PathoGenesis Pharmaceutical Technology, BGI-Shenzhen, Shenzhen, 518083, China.

[12]Shenzhen Engineering Laboratory for Innovative Molecular Diagnostics, BGI-Shenzhen, Shenzhen, 518120, China.

[13]School of Biology and Biological Engineering, South China University of Technology, Guangzhou, China.

[14]Guangdong Provincial Key Laboratory of Genome Read and Write, BGI-Shenzhen, Shenzhen, 518120, China.

[#]These authors contributed equally to this work.

[*]These authors are corresponding authors.

Email address: zhangww@genomics.cn

Email address: zhaojincun@gird.cn

Email address: lijunhua@genomics.cn

Email address: dryonghao@163.com

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Abstract

The emergence of the novel human coronavirus, SARS-CoV-2, causes a global COVID-19 (coronavirus disease 2019) pandemic. Here, we have characterized and compared viral populations of SARS-CoV-2 among COVID-19 patients within and across households. Our work showed an active viral replication activity in the human respiratory tract and the co-existence of genetically distinct viruses within the same host. The inter-host comparison among viral populations further revealed a narrow transmission bottleneck between patients from the same households, suggesting a dominated role of stochastic dynamics in both inter-host and intra-host evolutions.

Author summary

In this study, we compared SARS-CoV-2 populations of 13 Chinese COVID-19 patients. Those viral populations contained a considerable proportion of viral sub-genomic messenger RNAs (sgmRNA), reflecting an active viral replication activity in the respiratory tract tissues. The comparison of 66 identified intra-host variants further showed a low viral genetic distance between intra-household patients and a narrow transmission bottleneck size. Despite the co-existence of genetically distinct viruses within the same host, most intra-host minor variants were not shared between transmission pairs, suggesting a dominated role of stochastic dynamics in both inter-host and intra-host evolutions. Furthermore, the narrow bottleneck and active viral activity in the respiratory tract show that the passage of a small number of virions can cause infection. Our data have therefore delivered a key genomic resource for the SARS-CoV-2 transmission research and enhanced our understanding of the evolutionary dynamics of SARS-CoV-2.

Introduction

The rapid spread of the novel human coronavirus, SARS-CoV-2, has been causing millions of COVID-19 (coronavirus disease 2019) cases with high mortality rate worldwide [1,2]. As an RNA virus, SARS-CoV-2 mutates frequently due to the lack of sufficient mismatch repairing mechanisms during genome replication [3], leading to the development of genetically different viruses within the same host. Several studies have reported intra-host single nucleotide variants (iSNVs) in SARS-CoV-2 [4–6]. Recently, we investigated the intra-host evolution of SARS-CoV-2 and revealed genetic differentiation among tissue-specific populations [7]. However, it is still not clear how the intra-host variants circulate

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

among individuals. Here, we described and compared viral populations of SARS-CoV-2 among COVID-19 patients within and across households. Our work here demonstrated the utilization of viral genomic information to identify transmission linkage of this virus.

Results and discussion

Using both metatranscriptomic and hybrid-capture based techniques, we newly deep sequenced respiratory tract (RT) samples of seven COVID-19 patients in Guangdong, China, including two pairs of patients from the same households, respectively (P03 and P11; P23 and P24). The data were then combined with those of 23 RT samples used in our previous study [7], yielding a combined data set of 30 RT samples from 13 COVID-19 patients (**Table S1**).

A sustained viral population should be supported by an active viral replication [8]. We firstly estimated the viral transcription activity within RT samples using viral sub-genomic messenger RNAs (**sgmRNAs**), which is only synthesised in infected host cells [9]. The sgmRNA abundance was measured as the ratio of short reads spanning the transcription regulatory sequence (TRS) sites to the viral genomic reads. The sgmRNA abundance within nasal and throat swab samples was similar to that within sputum samples (**Figure 1a**), reflecting an active viral replication in the upper respiratory tract. Notably, the patient P01, who eventually passed away due to COVID-19, showed the highest level of sgmRNA abundance (**Figure S1**). Among the samples from patients with improved clinical outcomes, their viral Ct (cycle threshold) value of reverse transcriptase quantitative PCR (RT-qPCR) negatively correlated with the days post symptoms onset (**Figure 1b**). Interestingly, the sgmRNA abundance showed a similar trend across time (**Figure 1c**). This result is further strengthened by the positive correlation between sgmRNA abundance and the Ct value (**Figure 1d**), reflecting a direct biological association between viral replication and viral shedding in the respiratory tract tissues.

Using the metatranscriptomic data, we identified 66 iSNVs in protein encoding regions with the alternative allele frequency (AAF) ranged from 5% to 95% (**Table S2 and Table S3**). The identified iSNVs showed a high concordance between the AAFs derived from metatranscriptomic and that from hybrid-capture sequences (Spearman's ρ = 0.81, P < 2.2e-16; **Figure S2**). We firstly looked for signals of natural selection against intra-host variants. Using the Fisher's exact test, we compared the number of iSNV sites on each codon position against that of the other two positions and detected a significant difference among them (codon position 1[n = 10, P = 0.02], 2 [n = 21; P = 1] and 3 [n = 35;

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

P = 0.03]). However, those iSNVs did not show a discriminated AAF among the non-synonymous and synonymous categories (**Figure 2a**), suggesting that most non-synonymous variants were not under an effective purifying selection within the host. Among the 66 identified iSNVs, 30 were coincided with the consensus variants in the public database (**Table S2**). Those iSNVs were categorised into common iSNVs, while the iSNVs presented in a single patient were categorised into rare iSNVs. Interestingly, the common iSNVs had a significant higher minor allele frequency compared to the rare iSNVs (**Figure S3;** Wilcoxon rank sum test, *P* = 2.7e-05), suggesting that they may have been developed in earlier strains before the most recent infection.

We then estimated the viral genetic distance among samples in a pairwise manner based on their iSNVs and allele frequencies. The samples were firstly categorised into intra-host pairs (serial samples from the same host), intra-household pairs and inter-household pairs (**Figure 2b and Table S4**). As expected, the intra-host pairs had the lowest genetic distance compared to either intra-household pairs (Wilcoxon rank sum test, *P* = 0.018) and inter-household pairs (Wilcoxon rank sum test, *P* < 2.22e-16). Interestingly, the genetic distance between intra-household pairs was significantly lower than that of inter-household pairs (**Figure 2b;** Wilcoxon rank sum test, *P* = 0.03), supporting a direct passage of virions among intra-household individuals. Nonetheless, we only observed a few minor variants shared among intra-household pairs, suggesting that the estimated genetic similarity was mostly determined by consensus nucleotide differences (**Figure 2c,d**). Specifically, in one intra-household pair (P23 and P24), one patient (P23) contained iSNVs that were coincided with the linked variants, C8782T and T28144C, suggesting that this patient may have been co-infected by genetically distinct viruses. However, the strain carrying C8782T and T28144C was not observed in the intra-household counterpart (P24). It is likely that there is a narrow transmission bottleneck allowing only the major strain to be circulated, if P23 was infected by all the observed viral strains before the transmission.

The transmission bottlenecks among intra-household pairs were estimated using a beta binomial model, which was designed to allow some temporal stochastic dynamics of viral population in the recipient [10]. Here, we defined the donor and recipient within the intra-household pairs according to their dates of the first symptom onset. The estimated bottleneck sizes were 6 (P03 and P11) and 8 (P23 and P24) for the two intra-household pairs (**Table S5**). This result is consistent with the patterns observed in many animal viruses and human respiratory viruses [11,12], while the only study reporting

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

a loose bottleneck among human respiratory viral infections [13] was argued as the generic consequence of shared iSNVs caused by read mapping artefacts [14]. The relatively narrow transmission bottleneck sizes is expected to increase the variance of viral variants being circulated between transmission pairs [15]. Even after successful transmission, virions carrying the minor variants are likely to be purged out due to the frequent stochastic dynamics within the respiratory tract [7], which is also consistent with the low diversity and instable iSNV observed among the RT samples.

The observed narrow transmission bottleneck suggests that, in general, only a few virions successfully enter host cells and eventually cause infection. Although the number of transmitted virions is sparse, they can easily replicate in the respiratory tract, given the observed viral replication activities in all the RT sample types and the high host-cell receptor binding affinity of SARS-CoV-2 [16]. The narrow transmission bottleneck also indicate that instant hand hygiene and mask-wearing might be particular effective in blocking the transmission chain of SARS-CoV-2.

In summary, we have characterized and compared SARS-CoV-2 populations of patients within and across households using both metatranscriptomic and hybrid-capture based techniques. Our work showed an active viral replication activity in the human respiratory tract and the co-existence of genetically distinct viruses within the same host. The inter-host comparison among viral populations further revealed a narrow transmission bottleneck between patients from the same households, suggesting a dominated role of stochastic dynamics in both inter-host and intra-host evolution. The present work enhanced our understanding of SARS-CoV-2 virus transmission and shed light on the integration of genomic and epidemiological in the control of this virus.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Materials and methods

Patient and Ethics statement

Respiratory tract (RT) samples, including nasal swabs, throat swabs, sputum, were collected from 13 COVID-19 patients during the early outbreak of the pandemic (from January 25 to February 10 of 2020). Those patients were hospitalized at the first affiliated hospital of Guangzhou Medical University (10 patients), the fifth affiliated hospital of Sun Yat-sen University (1 patient), Qingyuan People's Hospital (1 patient) and Yangjiang People's Hospital (1 patient). The research plan was assessed and approved by the Ethics Committee of each hospital. All the privacy information was anonymized.

Dataset description

Public consensus sequences were downloaded from GISAID.

Real-time RT-qPCR and sequencing

RNA was extracted from the clinical RT samples using QIAamp Viral RNA Mini Kit (Qiagen, Hilden, Germany), which was then tested for SARS-CoV-2 using Real-time RT-qPCR. Human DNA was removed using DNase I and RNA concentration was measured using Qubit RNA HS Assay Kit (Thermo Fisher Scientific, Waltham, MA, USA). After human DNA-depletion, the samples were RNA purified and then subjected to double-stranded DNA library construction using the MGIEasy RNA Library preparation reagent set (MGI, Shenzhen, China) following the method used in the previous study [17]. Possible contamination during experimental processing was tracked using human breast cell lines (Michigan Cancer Foundation-7). The constructed libraries were converted to DNA nanoballs (DNBs) and then sequenced on the DNBSEQ-T7 platform (MGI, Shenzhen, China), generating paired-end short reads with 100bp in length. Most samples were also sequenced using hybrid capture-based enrichment approach that was described in previous study [17]. Briefly, the SARS-CoV-2 genomic content was enriched from the double-stranded DNA libraries using the 2019-nCoVirus DNA/RNA Capture Panel (BOKE, Jiangsu, China). The enriched SARS-CoV-2 genomic contents were converted to DNBs and then sequenced on the MGISEQ-2000 platform, generating paired-end short reads with 100bp in length.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Data filtering

Read data from both metatranscriptomic and hybrid capture based sequencing were filtered following the steps described in the previous research [17]. In brief, short read data were mapped to a database that contains major coronaviridae genomes. Low-quality, adaptor contaminations, duplications, and low-complexity within the mapped reads were removed to generate the high quality coronaviridae-like short read data.

Profiling of sub-genomic messenger RNA (sgmRNAs)

Coronaviridae-like short reads were mapped to the reference genome (EPI_ISL_402119) using the aligner HISAT2 [18]. Reads spanning the transcription regulatory sequence (TRS) sites of both leader region and the coding genes (S gene, ORF3a, 6, 7a, 8, E, M and N gene) were selected to represent the sgmRNAs. The junction sites were predicted using RegTools junctions extract [19]. The ratio of sgmRNA reads to the viral genomic RNA reads (sgmRNA ratio) was used to estimate the relative transcription activity of SARS-CoV-2.

Detection of intra-host variants

We defined an intra-host single nucleotide variant (iSNV) as the co-existence of an alternative allele and the reference allele at the same genomic position within the same sample. To identify iSNV sites, paired-end metatranscriptomic coronaviridae-like short read data were mapped to the reference genome (EPI_ISL_402119) using BWA aln (v.0.7.16) with default parameters [20]. The duplicated reads were detected and marked using Picard MarkDuplicates (v. 2.10.10) (http://broadinstitute.github.io/picard). Nucleotide composition of each genomic position was characterized from the read mapping results using pysamstats (v. 1.1.2) (https://github.com/alimanfoo/pysamstats). The variable sites of each sample were identified using the variant caller LoFreq with default filters and the cut-off of 5% minor allele frequency. After filtering the sites with more than one alternative allele, the rest sites were regarded as iSNV sites. All the iSNVs with less than five metatranscriptomic reads were verified using the hybrid capture data (at least two reads). The identified iSNVs were then annotated using the SnpEff (v.2.0.5) with default settings [21].

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Genetic distance

The genetic distance between sample pairs was calculated using L1-norm distance, as defined by the following formula. The L1-norm distance (D) between sample pairs is calculated by summing the distance of all the variable loci (N). The distance on each variable locus is calculated between vectors (p and q for each sample) of possible base frequencies ($n=4$¿.

$$D=\sum_{k=1}^{N}\sum_{i=1}^{n} ¿\, p_i-q_i \vee ¿¿$$

To verify the result, L2-norm distance (Euclidean distance) between sample pairs was calculated. The L2-norm distance $d(p,q)$ between two samples (p,q) is the square root of sum of distance across all the variable loci (N), as defined by the following formula.

$$d(p,q)=\sqrt{\sum_{i=1}^{n}(p_i-q_i)^2}$$

The comparison of genetic distances among sample pair categories was performed using the Wilcoxon rank-sum test.

Beta binomial model of bottleneck size estimation

A beta-binomial model was used to estimate bottleneck sizes between donors and recipients. Here, the bottleneck size represents the number of virions that pass into the recipient and finally shape the sequenced viral population. The patient with the earlier symptom onset date was defined as the donor, while the other was defined as the recipient. The maximum-likelihood estimates (MLE) of bottleneck sizes were estimated within 95% confidence intervals.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

References

1. Wu F, Zhao S, Yu B, Chen YM, Wang W, Song ZG, et al. A new coronavirus associated with human respiratory disease in China. Nature. 2020. doi:10.1038/s41586-020-2008-3

2. Zhou P, Yang X Lou, Wang XG, Hu B, Zhang L, Zhang W, et al. A pneumonia outbreak associated with a new coronavirus of probable bat origin. Nature. 2020. doi:10.1038/s41586-020-2012-7

3. Smith EC, Sexton NR, Denison MR. Thinking Outside the Triangle: Replication Fidelity of the Largest RNA Viruses. Annu Rev Virol. 2014;1: 111–132. doi:10.1146/annurev-virology-031413-085507

4. Shen Z. Genomic diversity of SARS-CoV-2 in Coronavirus Disease 2019 patients. bioRvix. 2019; 1–27.

5. Butler DJ, Mozsary C, Meydan C, Danko D, Foox J, Rosiene J, et al. Shotgun Transcriptome and Isothermal Profiling of SARS-CoV-2 Infection Reveals Unique Host Responses, Viral Diversification, and Drug Interactions. bioRxiv. 2020. doi:10.1101/2020.04.20.048066

6. Fraser C, Crook D, Peto T, Andersson M, Jeffries K, Eyre D, et al. Shared SARS-CoV-2 diversity suggests localised transmission of minority variants. 2020.

7. Wang Y, Wang D, Zhang L, Sun W, Zhang Z, Chen W, et al. Intra-host Variation and Evolutionary Dynamics of SARS-CoV-2 Population in COVID-19 Patients. bioRxiv. 2020. doi:10.1101/2020.05.20.103549

8. Wölfel R, Corman VM, Guggemos W, Seilmaier M, Zange S, Müller MA, et al. Virological assessment of hospitalized patients with COVID-2019. Nature. 2020. doi:10.1038/s41586-020-2196-x

9. Sola I, Almazán F, Zúñiga S, Enjuanes L. Continuous and Discontinuous RNA Synthesis in Coronaviruses. Annu Rev Virol. 2015;2: 265–288. doi:10.1146/annurev-virology-100114-055218

10. Sobel Leonard A, Weissman DB, Greenbaum B, Ghedin E, Koelle K. Transmission Bottleneck Size Estimation from Pathogen Deep-Sequencing Data, with an Application to Human Influenza A Virus. J Virol. 2017;91: 0–19. doi:10.1128/jvi.00171-17

11. Zwart MP, Elena SF. Matters of Size: Genetic Bottlenecks in Virus Infection and Their Potential Impact on Evolution. Annu Rev Virol. 2015;2: 161–179. doi:10.1146/annurev-

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

261 virology-100114-055135

26212. McCrone JT, Woods RJ, Martin ET, Malosh RE, Monto AS, Lauring AS. Stochastic processes
263 constrain the within and between host evolution of influenza virus. Elife. 2018;7: 1–19.
264 doi:10.7554/eLife.35962

26513. Poon LLM, Song T, Rosenfeld R, Lin X, Rogers MB, Zhou B, et al. Quantifying influenza virus
266 diversity and transmission in humans. Nat Genet. 2016;48: 195–200. doi:10.1038/ng.3479

26714. Xue KS, Bloom JD. Reconciling disparate estimates of viral genetic diversity during human
268 influenza infections. Nat Genet. 2019;51: 1298–1301. doi:10.1038/s41588-019-0349-3

26915. Xue KS, Moncla LH, Bedford T, Bloom JD. Within-Host Evolution of Human Influenza Virus.
270 Trends Microbiol. 2018;26: 781–793. doi:10.1016/j.tim.2018.02.007

27116. Shang J, Ye G, Shi K, Wan Y, Luo C, Aihara H, et al. Structural basis of receptor recognition
272 by SARS-CoV-2. Nature. 2020. doi:10.1038/s41586-020-2179-y

27317. Xiao M, Liu X, Ji J, Li M, Li J, Sun W, et al. Multiple approaches for massively parallel
274 sequencing of HCoV-19 genomes directly from clinical samples 2. 2020; 33.
275 doi:10.1101/2020.03.16.993584

27618. Kim D, Langmead B, Salzberg SL. HISAT: A fast spliced aligner with low memory
277 requirements. Nat Methods. 2015. doi:10.1038/nmeth.3317

27819. Feng Y-Y, Ramu A, Cotto KC, Skidmore ZL, Kunisaki J, Conrad DF, et al. RegTools:
279 Integrated analysis of genomic and transcriptomic data for discovery of splicing variants in
280 cancer. bioRxiv. 2018. doi:10.1101/436634

28120. Li H, Durbin R. Fast and accurate long-read alignment with Burrows-Wheeler transform.
282 Bioinformatics. 2010. doi:10.1093/bioinformatics/btp698

28321. Cingolani P, Platts A, Wang LL, Coon M, Nguyen T, Wang L, et al. A program for annotating
284 and predicting the effects of single nucleotide polymorphisms, SnpEff. Fly (Austin). 2012.
285 doi:10.4161/fly.19695

286

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

DATA AVAILABILITY

The data that support the findings of this study have been deposited into CNSA (CNGB Sequence Archive) of CNGBdb with the accession number CNP0001111 (https://db.cngb.org/cnsa/).

DISCLOSURE STATEMENT

No conflict of interest was reported by the authors

ACKNOWLEDGEMENTS

This study was approved by the Health Commission of Guangdong Province to use patients' specimen for this study. This study was funded by grants from The National Key Research and Development Program of China (2018YFC1200100, 2018ZX10301403, 2018YFC1311900), the emergency grants for prevention and control of SARS-CoV-2 of Ministry of Science and Technology (2020YFC0841400), Guangdong province (2020B111107001, 2020B111108001, 2020B111109001, 2018B020207013, 2020B111112003), the Guangdong Province Basic and Applied Basic Research Fund (2020A1515010911), Guangdong Science and Technology Foundation (2019B030316028), Guangdong Provincial Key Laboratory of Genome Read and Write (2017B030301011) and Guangzhou Medical University High-level University Innovation Team Training Program (Guangzhou Medical University released [2017] No.159). This work was supported by the Shenzhen Municipal Government of China Peacock Plan (KQTD2015033017150531). This work was supported by China National GeneBank (CNGB). We thank the patients who took part in this study.

AUTHOR CONTRIBUTIONS

D.W., Y.X., J.L., W.Z. and J.Z. conceived the study, Y.W., L.Z., and Y.L. collected clinical specimen and executed the experiments. D.W., W.S., X.C. and J.J. analyzed the data. All the authors participated in discussion and result interpretation. D.W., Y.W., and Z.Z. wrote the manuscript. All authors revised and approved the final version.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

Figures

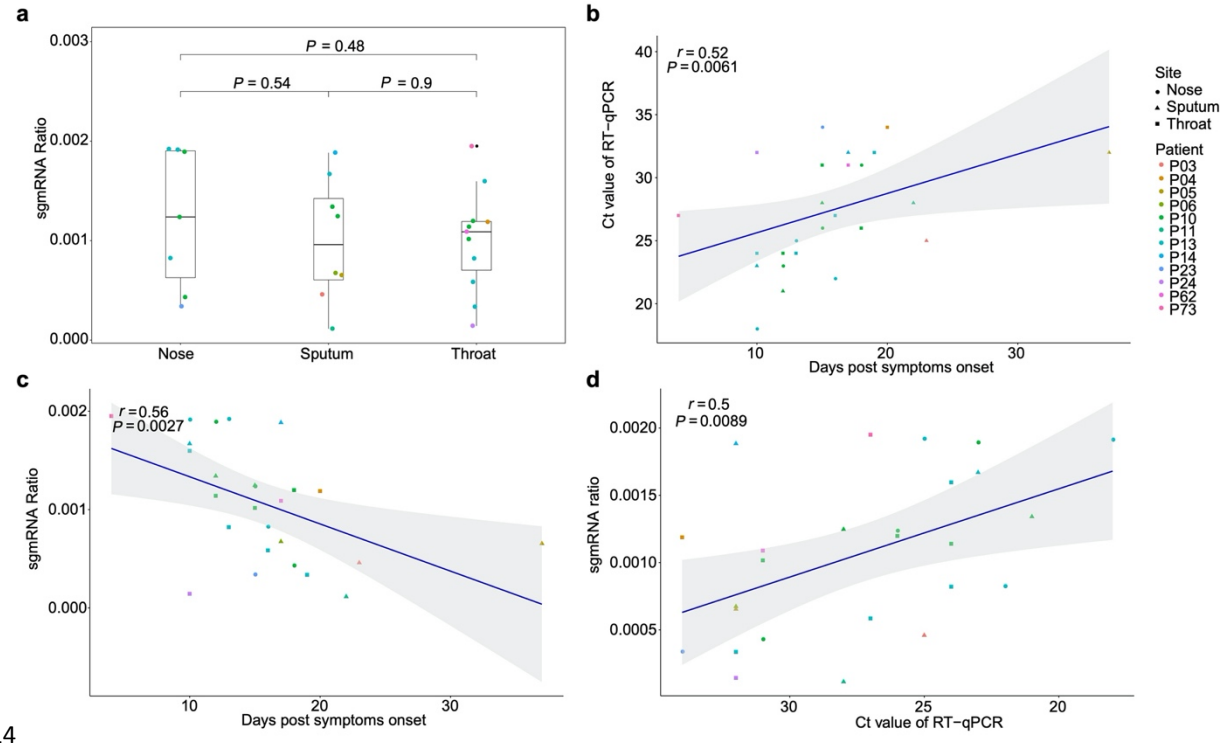
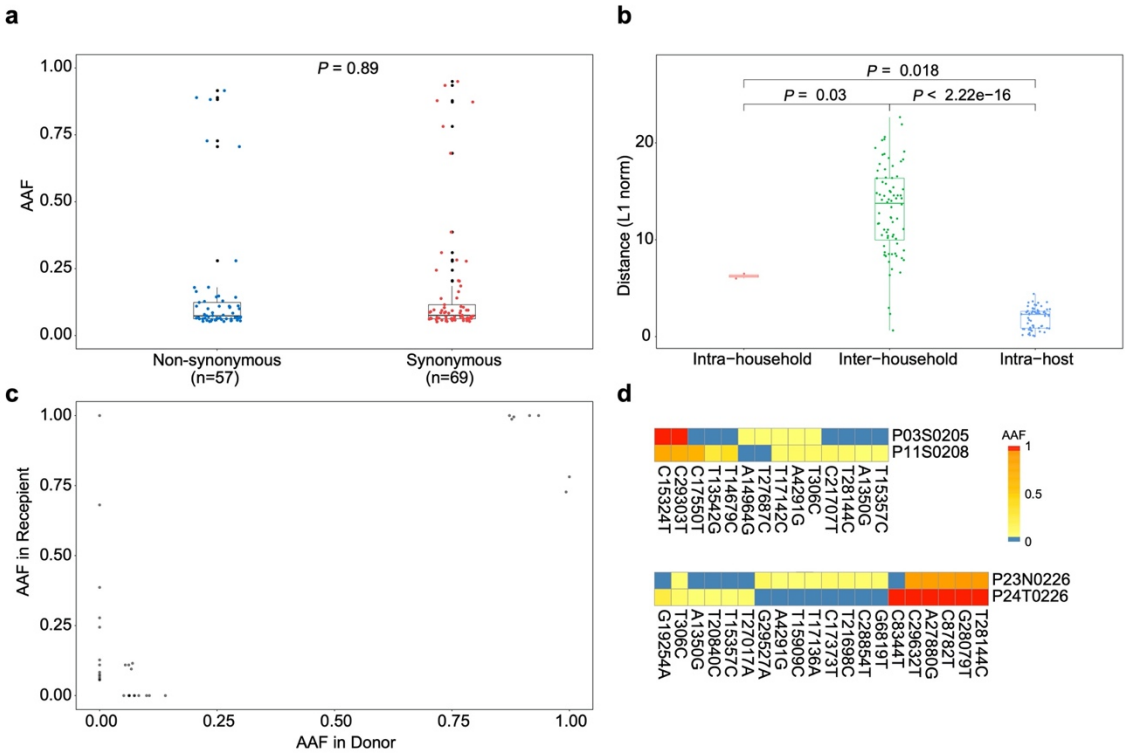


Figure 1. sub-genomic messenger RNAs (sgmRNAs)

a, The ratio of sgmRNA of each respiratory sample type (nasal, throat swabs and sputum)**. b,** Correlation between the cycle threshold (Ct) of RT-qPCR and the days post symptoms onset. **c,** Correlation between estimated sgmRNA ratio and the days post symtoms onset. **d,** Correlation between estimated sgmRNA ratio and the cycle threshold of RT-qPCR.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.



320

321**Figure 2. Allele frequency changes of transmission pairs**

322**a,** Box plots showing the alternative allele frequency (AAF) distribution of synonymous and non-
323synonymous intra-host variants. **b,** Box plots representing the L1-norm distance distribution among
324sample pairs. Each dot represents the genetic distance between each sample pair. **c,** The AAF of
325donor iSNVs in transmission pairs. Allele frequencies under 5% and over 95% were adjusted to 0%
326and 1, respectively. **d,** Heatmap representing the alternative allele frequencies (AAFs) of consensus
327and intra-host single nucleotide variants (iSNVs) of the two transmission pairs.

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

SUPPLEMENTARY INFORMATION

Table S1. Demography and clinical outcomes of COVID-19 patients

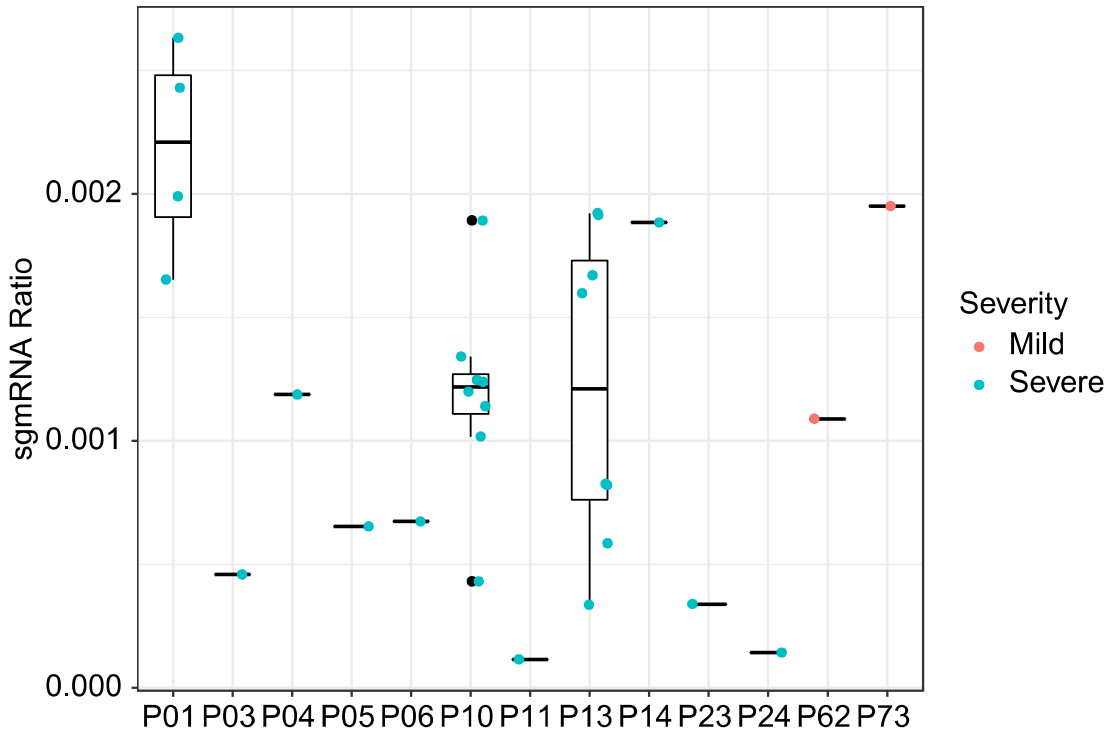
Table S2. Summary of iSNVs

Table S3. Frequency of iSNVs

Table S4. Inter-host genetic distance (L1 and L2-norm)

Table S5. Bottleneck size of intra-household pairs

bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

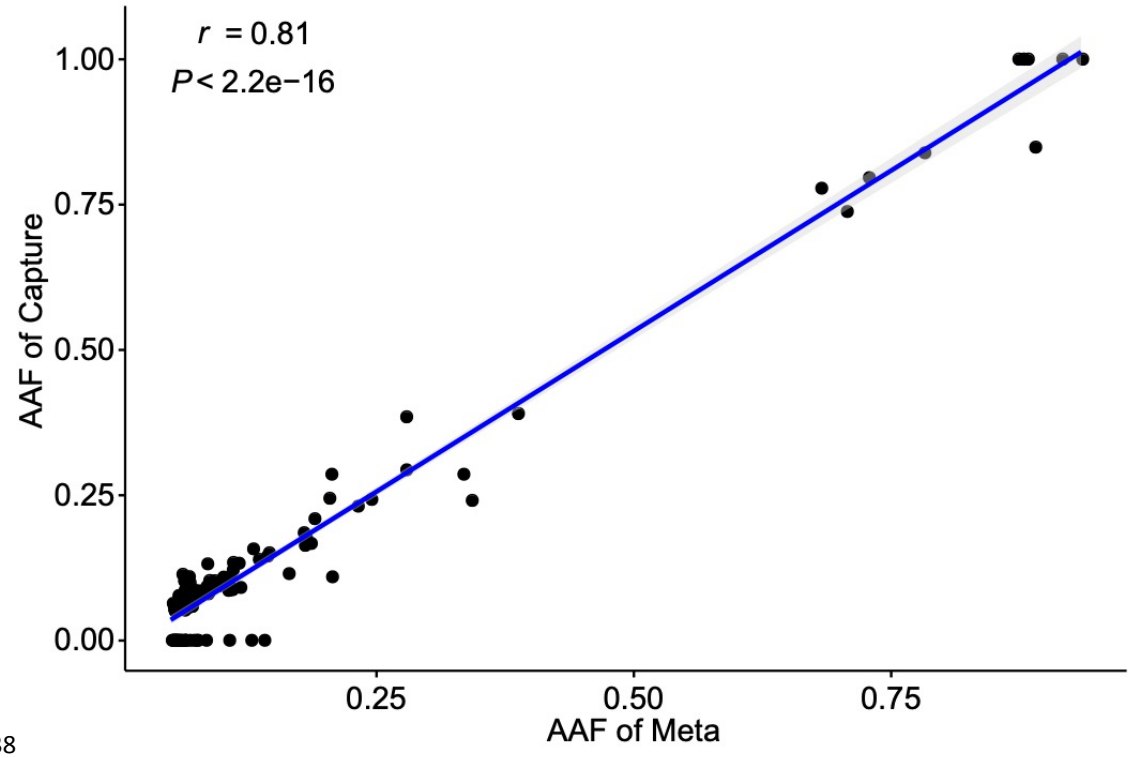


335

336**Figure S1. Transcription profile of sub-genomic messenger RNAs (sgmRNAs) of each patient.**

337

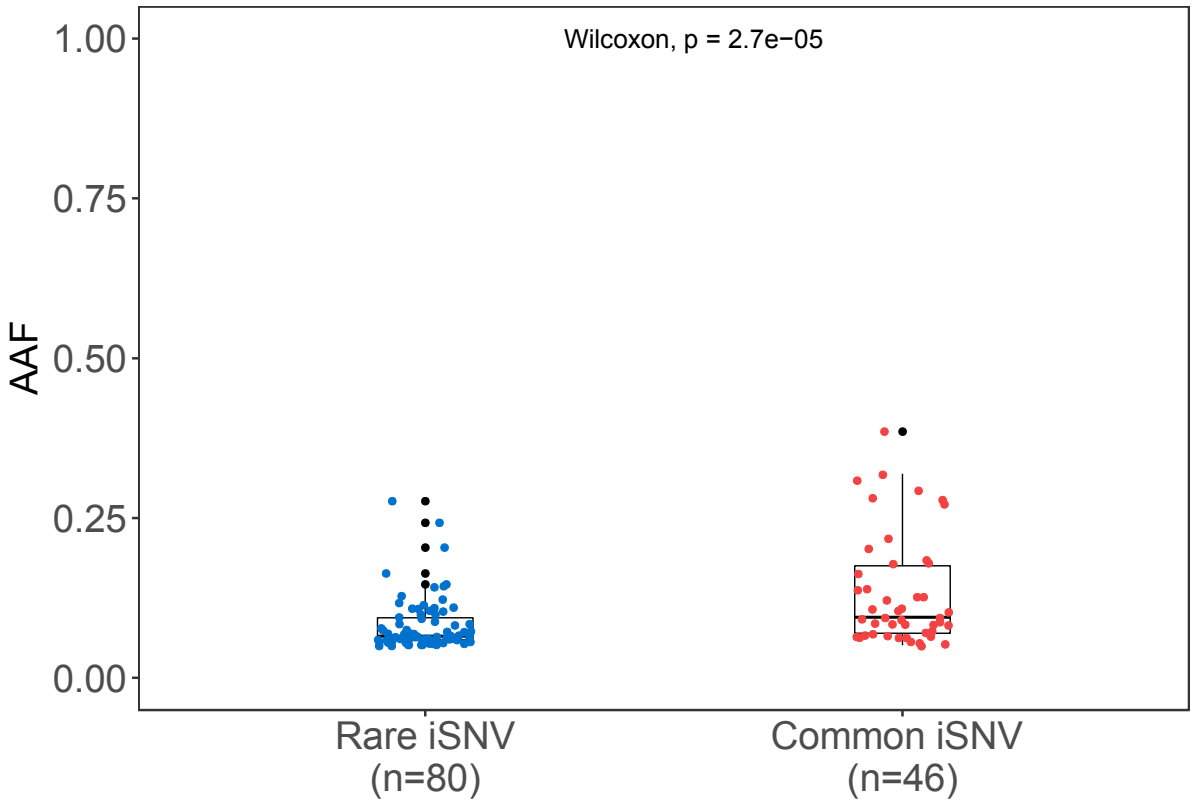
bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.



338

339**Figure S2. Concordance between minor alternative allele frequencies (AAFs) derived from**

340**metagenomic and hybrid capture data.**

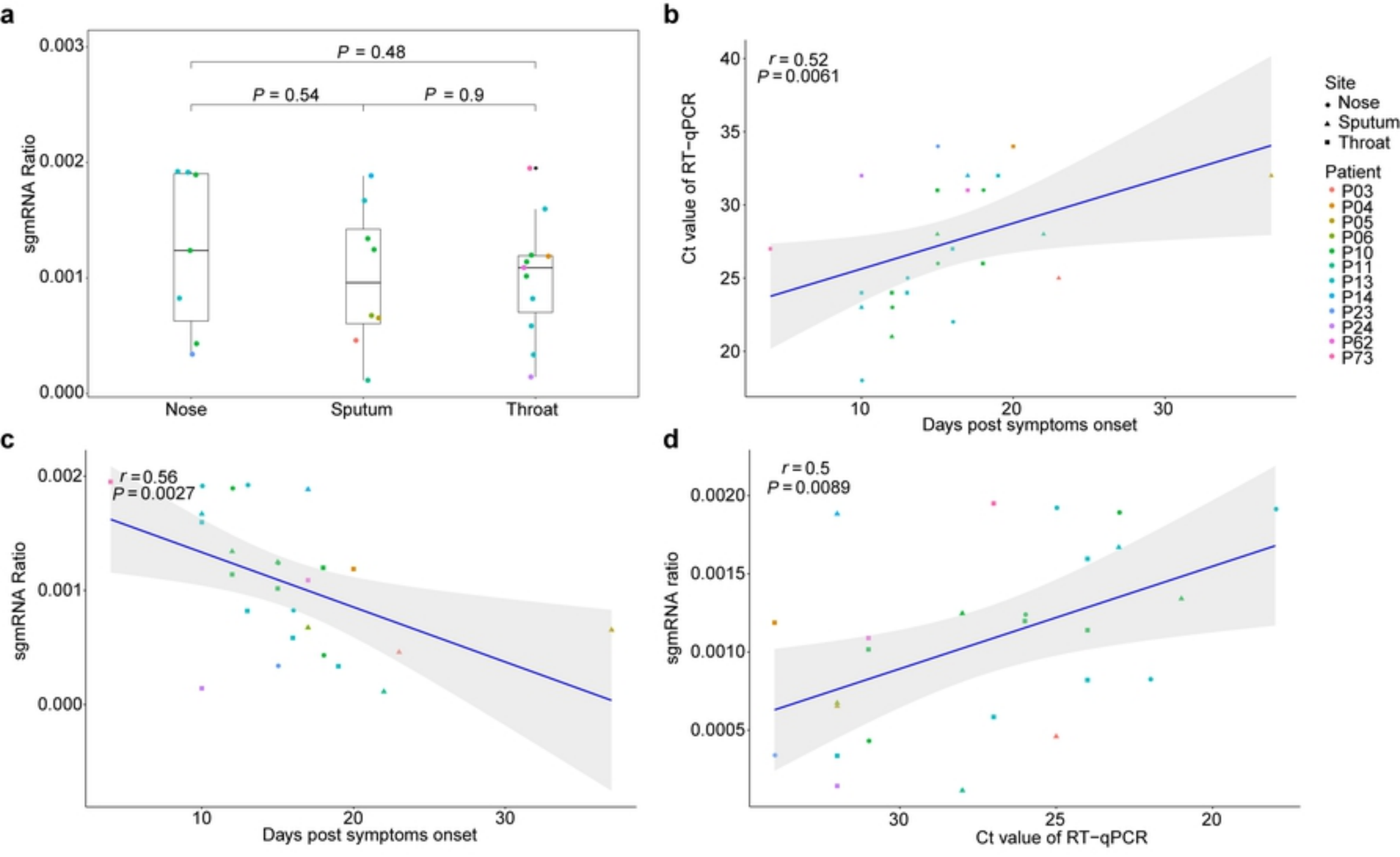


341

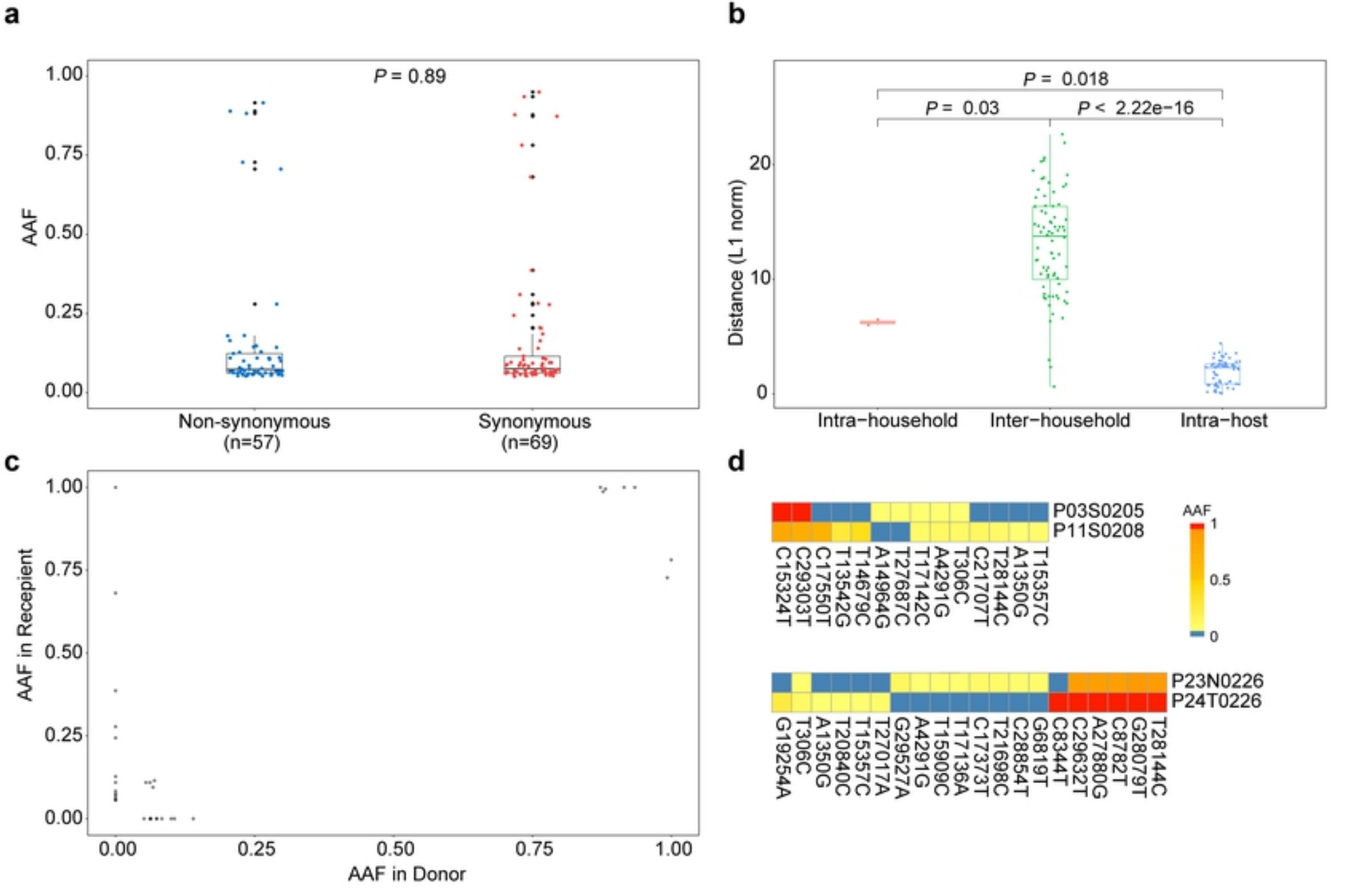
bioRxiv preprint doi: https://doi.org/10.1101/2020.06.26.173203; this version posted June 26, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under aCC-BY 4.0 International license.

342**Figure S3. Alternative allele frequency (AAF) distribution of rare and common iSNVs**

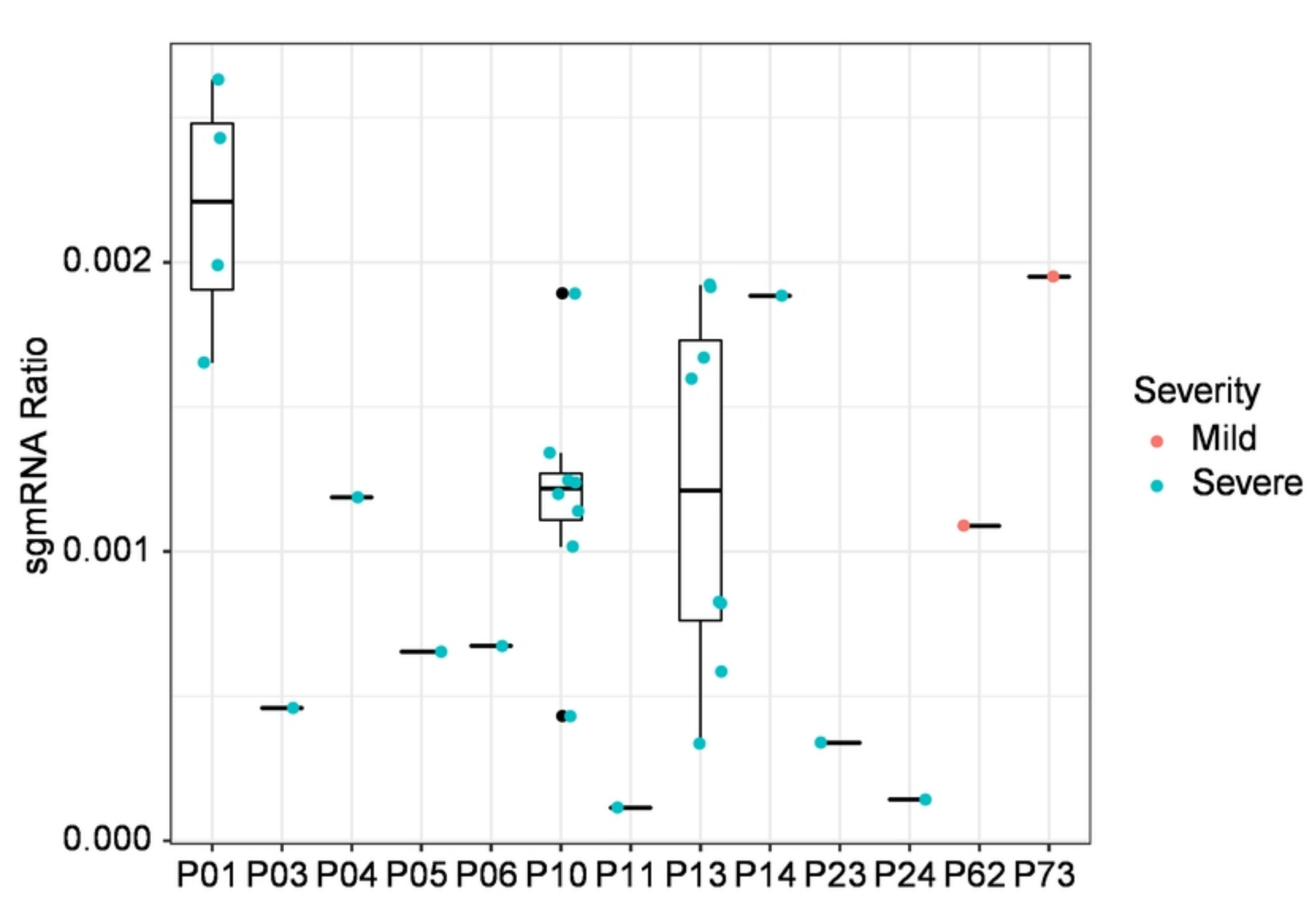
343


a
P = 0.48
P = 0.54
P = 0.9
sgmRNA Ratio
0.003
0.002
0.001
0.000
Nose
Sputum
Throat
b
r = 0.52
P = 0.0061
Ct value of RT−qPCR
40
35
30
25
20
10
20
30
Days post symptoms onset
Site
Nose
Sputum
Throat
Patient
P03
P04
P05
P06
P10
P11
P13
P14
P23
P24
P62
P73
c
r = 0.56
P = 0.0027
sgmRNA Ratio
0.002
0.001
0.000
10
20
30
Days post symptoms onset
d
r = 0.5
P = 0.0089
sgmRNA ratio
0.0020
0.0015
0.0010
0.0005
30
25
20
Ct value of RT−qPCR

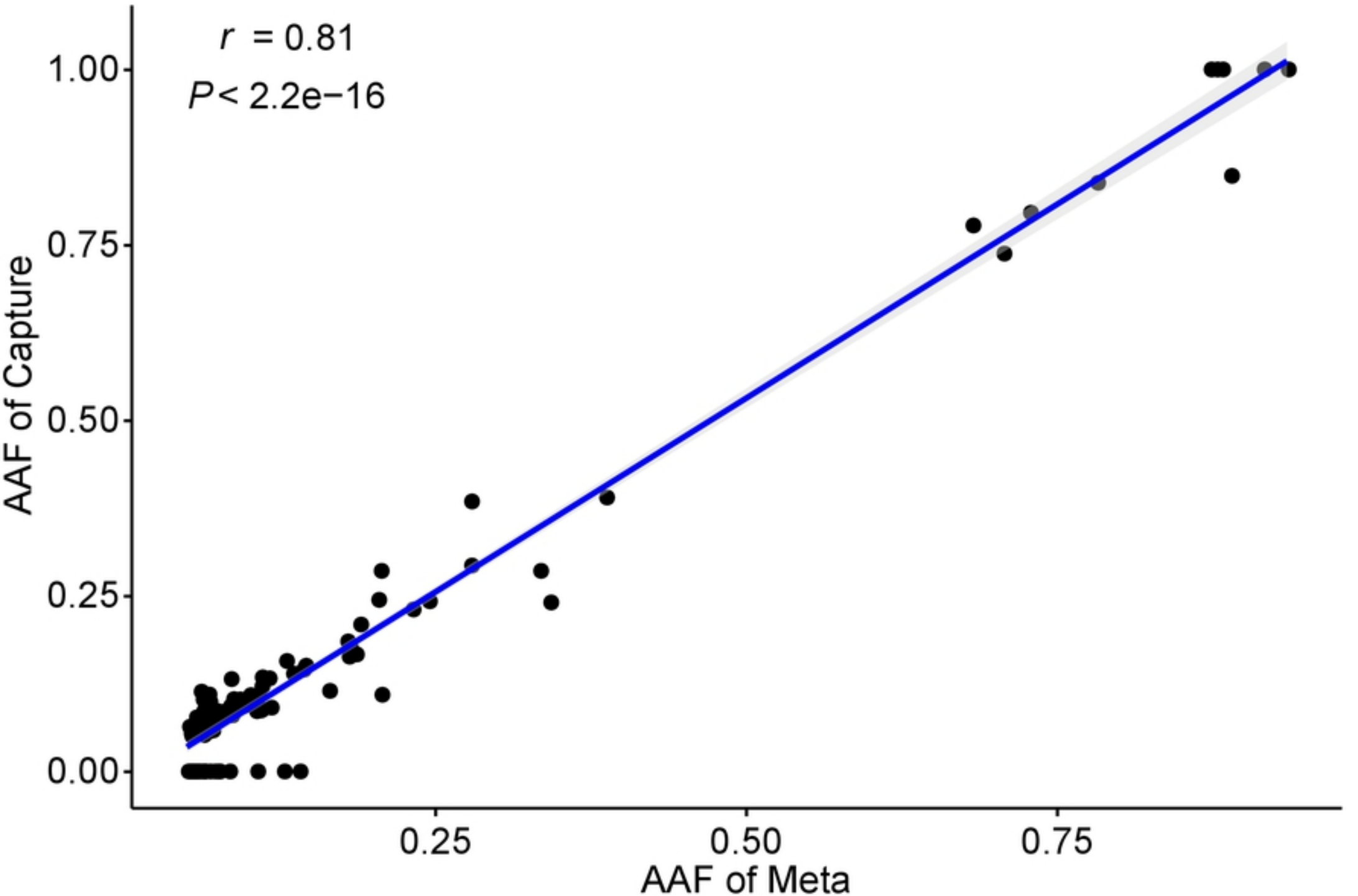
Figure


a
P = 0.89
AAF
1.00
0.75
0.50
0.25
0.00
Non-synonymous
(n=57)
Synonymous
(n=69)
b
P = 0.018
P = 0.03
P < 2.22e−16
Distance (L1 norm)
20
10
0
Intra−household
Inter−household
Intra−host
c
AAF in Recepient
AAF in Donor
0.00
0.25
0.50
0.75
1.00
d
P03S0205
P11S0208
C15324T
C29303T
C17550T
T13542G
T14679C
A14964G
T27687C
T17142C
A4291G
T306C
C21707T
T28144C
A1350G
T15357C
AAF
1
0.5
0
P23N0226
P24T0226
G19254A
T306C
A1350G
T20840C
T15357C
T27017A
G29527A
A4291G
T15909C
T17136A
C17373T
T21698C
C28854T
G6819T
C8344T
C29632T
A27880G
C8782T
G28079T
T28144C

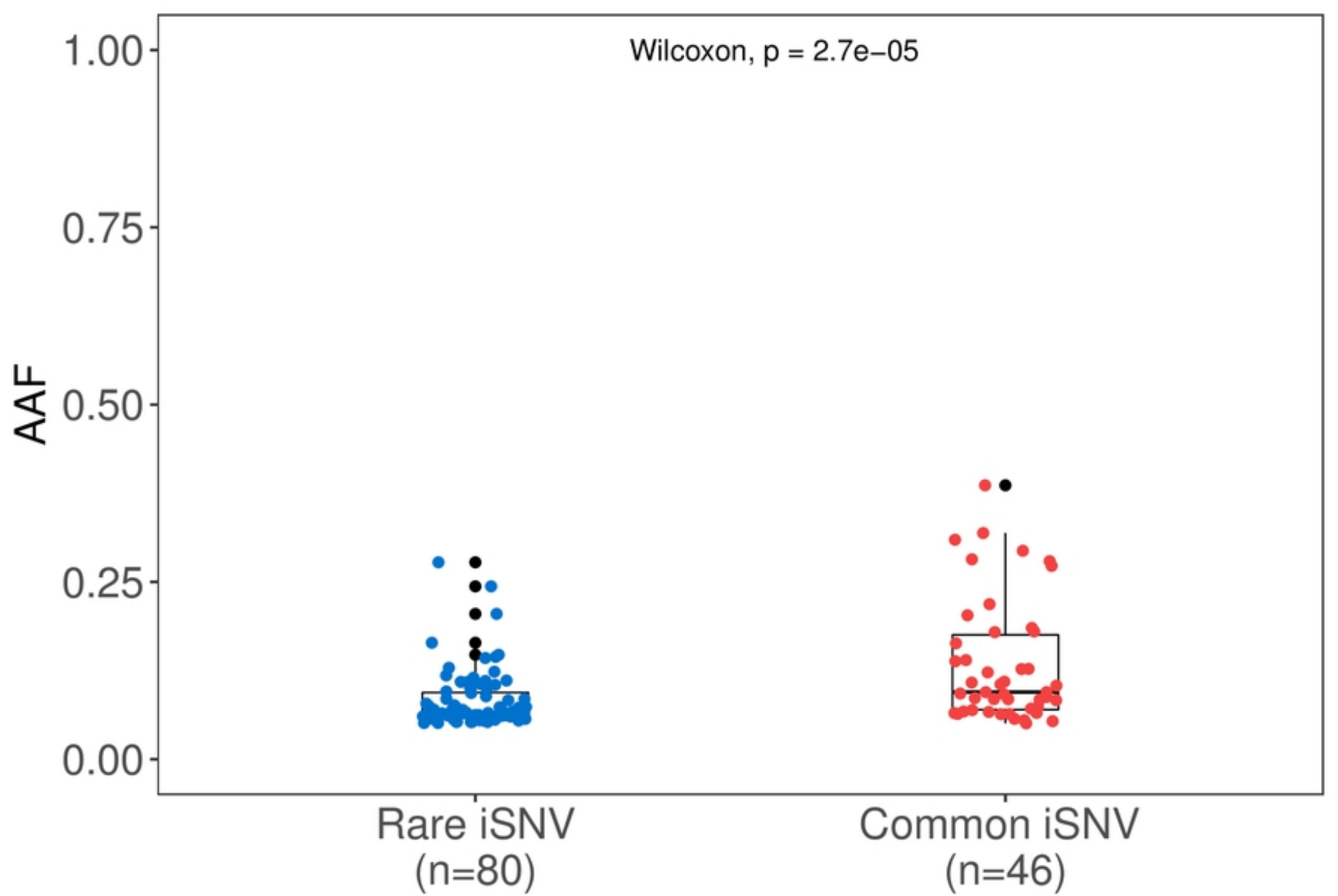
Figure


sgmRNA Ratio
0.002
0.001
0.000
P01 P03 P04 P05 P06 P10 P11 P13 P14 P23 P24 P62 P73
Severity
Mild
Severe

Figure


r = 0.81
P < 2.2e−16
1.00
0.75
0.50
0.25
0.00
AAF of Capture
0.25
0.50
0.75
AAF of Meta

Figure


Wilcoxon, p = 2.7e−05
AAF
1.00
0.75
0.50
0.25
0.00
Rare iSNV
(n=80)
Common iSNV
(n=46)

Figure