

# **Genomic epidemiology reveals the variation and transmission properties of SARS-CoV-2 in a single-source community outbreak**

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#### Abstract

Severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) has caused the coronavirus disease 2019 (COVID-19) pandemic, which is still a global public health concern. During March 2022, a rapid and confned single-source outbreak of SARS-CoV-2 was identifed in a community in Nanjing municipal city. Overall, 95 individuals had laboratory-confrmed SARS-CoV-2 infection. The whole genomes of 61 viral samples were obtained, which were all members of the BA.2.2 lineage and clearly demonstrated the presence of one large clade, and all the infections could be traced back to the original index case. The most distant sequence from the index case presented a difference of 4 SNPs, and 118 intrahost single-nucleotide variants (iSNVs) at 74 genomic sites were identifed. Some minor iSNVs can be transmitted and subsequently rapidly fxed in the viral population. The minor iSNVs transmission resulted in at least two nucleotide substitutions among all seven SNPs identifed in the outbreak, generating genetically diverse populations. We estimated the overall transmission bottleneck size to be 3 using 11 convincing donor–recipient transmission pairs. Our study provides new insights into genomic epidemiology and viral transmission, revealing how iSNVs become fxed in local clusters, followed by viral transmission across the community, which contributes to population diversity.

Keywords: SARS-CoV-2; genomic epidemiology; phylogeny; variant; bottleneck

## **Background**

Severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) is the causative agent of coronavirus disease 2019 (COVID-19). SARS-CoV-2 variants with increased transmissibility, increased virulence, or decreased vaccine effectiveness were designated as previously circulating variants of concern (VOCs), namely, Alpha, Beta, Gamma, Delta, and Omicron [\(Zhao et](#page-7-0) al. 2022, [Carabelli et](#page-6-0) al. [2023\)](#page-6-0). Among them, the SARS-CoV-2 Omicron variant exhibits striking immune evasion ability and is rapidly spreading worldwide [\(Hong et](#page-6-1) al. 2022).

<span id="page-0-9"></span><span id="page-0-8"></span>With the widespread use of deep sequencing methods, genomic epidemiology has become a powerful tool for determining the public health response to communicable disease outbreaks [\(Lu](#page-7-1)  et [al. 2020,](#page-7-1) [Komissarov et](#page-6-2) al. 2021, [Aggarwal et](#page-6-3) al. 2022, [Gu](#page-6-4)  et [al. 2022,](#page-6-4) [MacCannell et](#page-7-2) al. 2022). This is particularly true for diseases such as COVID-19, which shows a high spreading speed and a high proportion of asymptomatic infections. SARS-CoV-2 infections have been associated with outbreaks in many types of settings. Whole-genome sequencing (WGS) has been used to monitor the emergence of circulating strains and identify contentious links in outbreaks, enabling accurate clustering.

<span id="page-0-13"></span><span id="page-0-12"></span><span id="page-0-10"></span><span id="page-0-7"></span><span id="page-0-6"></span><span id="page-0-5"></span>Moreover, SARS-CoV-2 mutates between and within hosts to alter viral infectivity, disease severity, or interactions with host immunity. Intrahost single-nucleotide variants (iSNVs) that emerge in the course of a virus epidemic could provide valuable information about the sizes of transmission bottlenecks, chains of person-to-person transmission, viral diversity, and the process of virus evolution [\(Wang et al. 2021b\)](#page-7-3). Viral transmission bottlenecks determine the amount of genetic diversity produced in one host that could be passed on to another during transmission

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and generally constrain the evolution of viruses [\(Markov et](#page-7-4) al. [2023\)](#page-7-4). Although current studies have mostly shown that SARS-CoV-2 has a narrow transmission bottleneck, further exploration may need to identify whether variants with certain characteristics are more likely to be transferred or whether the narrow bottleneck means that the passages of viral particles occur in a more random way such that minor iSNVs also have similar chances. Whether early Omicron BA.2.2 transmission exhibits characteristics similar to those of the Delta variant or the previous VOCs with respect to iSNV transmission and bottleneck sizes remain to be further elucidated.

In this study, we investigated the transmission characteristics of the Omicron BA.2.2 variant during a community-level outbreak that occurred in early March 2022. Prompt responses, including population nucleic acid screening in high-risk areas, intensive contact tracing, quarantining, and genomic analysis, were implemented, and the outbreak occurred over a short period. Our results provide genetic and epidemiological evidence and identify the infection source and variant profles of this community transmission event.

## **Methods**

## **Case defnition, sample collection, and epidemiological investigation**

Samples were collected, and SARS-CoV-2 testing was performed on oropharyngeal swabs during this outbreak. The PCR screening tests were performed by third-party institutions or the local Center for Disease Prevention and Control (CDC). Epidemiological surveys were implemented for all the cases, and the exposure history of positive cases and their close contacts was obtained through feld investigations. Interviews were conducted, and public video surveillance systems were used to identify those who had direct or indirect contact with the cases. The contacts of the index cases were quarantined centrally or at home.

## **Genomic sequencing of SARS-CoV-2**

Combined with epidemiological information, some of the positive samples were sequenced. The Target Capture Kit for SARS-CoV-2 Whole Genome (Baiyi Technology Co., Ltd, China) was used for the reverse transcription and genome amplifcation of the extracted RNA samples. The sequencing libraries were prepared via the Nextera XT Library Prep Kit (Illumina, USA) and subjected to end repair, A-tailing, and adaptor ligation. Negative controls were prepared with nuclease-free water. A high-throughput sequencing protocol according to the Illumina MiniSeq High Output Reagent Kit (300 cycles) was used. The genomic data were analyzed via the BAIYI MicroGeno Platform (v4.1, Hangzhou Baiyi Technology Co., Ltd, [http://www.baiyi-tech.cn/,](http://www.baiyi-tech.cn/) China). Fastp [\(Chen et](#page-6-5) al. [2018\)](#page-6-5) (v0.23.2, [https://github.com/OpenGene/fastp\)](https://github.com/OpenGene/fastp) was used to control the quality of the original data, and bwa (0.7.17-r1188, [https://github.com/lh3/bwa\)](https://github.com/lh3/bwa) was used to compare the data to the SARS-CoV-2 reference genome Wuhan-Hu-1 (GenBank Accession No: MN908947.3). The whole-genome sequence was assembled via bcftools [\(Danecek et](#page-6-6) al. 2021) (V1.12, [https://github.com/](https://github.com/samtools/bcftools) [samtools/bcftools\)](https://github.com/samtools/bcftools). Samples with coverage less than 95% were fltered out. Some cases were sampled and sequenced twice, and the higher coverage sequences were retained. Finally, 61 fltered SARS-CoV-2 samples were used for subsequent analysis.

#### <span id="page-1-1"></span>**Phylogenetic tree construction**

From January 2022 to 30 April 2022, genomes of the Pango lineage BA.2 and its subbranches were randomly selected from the <span id="page-1-6"></span><span id="page-1-5"></span>GISAID database [\(http://gisaid.org/\)](http://gisaid.org/), and a total of 4642 SARS-CoV-2 sequences were obtained. After mafft (v7.487, [https://github.](https://github.com/GSLBiotech/mafft) [com/GSLBiotech/mafft\)](https://github.com/GSLBiotech/mafft) was used to compare the sequences from the GISAID database with 61 samples from this study, a phylogenetic tree was constructed via FastTree (Price et [al. 2009\)](#page-7-5) [\(http://](http://www.microbesonline.org/fasttree/) [www.microbesonline.org/fasttree/\)](http://www.microbesonline.org/fasttree/). A time-related phylogenetic tree was constructed via nextstrain build (v7.0.1, [https://github.](https://github.com/nextstrain/ncov) [com/nextstrain/ncov\)](https://github.com/nextstrain/ncov).

#### **SNP and iSNV analysis**

Snippy (v4.6.0, [https://github.com/tseemann/snippy\)](https://github.com/tseemann/snippy) was used to calculate the differences in mutation sites between 61 samples and obtain the difference matrix. SNP sites were analyzed via the sns.clustermap (V0.11.1) in Python on the basis of the Euclidean distance. Nucleotide variations in relation to the reference sequence (the consensus sequence of NJ01) were identifed and classifed as iSNVs, which coexisted with the reference allele at an identical position. Mutational sites were detected via free-Bayes (v1.3.2, [https://github.com/freebayes/freebayes\)](https://github.com/freebayes/freebayes), and sites with a mutation frequency greater than 5% were retained. We defned iSNVs as those with alternative allele frequencies (AAFs) between 5% and 95% (Wang et [al. 2021a\)](#page-7-6). The iSNVs were identifed only in samples with a minimum coverage of 60X of the read data for 95% of the genomic regions. The minor allele frequency was accepted by at least fve reads. The consensus sequence was generated according to the majority alleles (more than 50%) at each position.

# <span id="page-1-7"></span>**Bottleneck estimation**

<span id="page-1-4"></span><span id="page-1-3"></span><span id="page-1-2"></span>We excluded the head and tail sequences of the viral genome (positions 1–100 and 29 803 to 29 903) and the 23 "highly shared" sites [\(Lythgoe et](#page-7-7) al. 2021, Li et [al. 2022\)](#page-6-7). On the basis of the defned chains of transmission, we identifed 11 donor−recipient pairs. We applied the approximate version and exact version of the betabinomial sampling method [\(Leonardl et](#page-6-8) al. 2017), using a 5% minimum variant frequency cutoff to call the variants. The error bars denote the 95% confdence intervals. We estimated the bottleneck sizes of each transmission pair individually and calculated the overall transmission bottleneck sizes across transmission pairs.

#### Results

## **Outbreak description and epidemiological information**

<span id="page-1-0"></span>A local outbreak was declared in Jiangning district when the index patient NJ01 was identifed via regular PCR screening for returning populations on the morning of 10 March 2022. We discovered 95 people who had SARS-CoV-2 infections between 10 and 26 March 2022, with a time frame of 16 days. The date of diagnosis of the frst positive case, NJ01, was referred to as Day 0. On the basis of the discovered transmission connections and epidemiological links involving residences and time frames, these cases were grouped into six epidemiological clusters (A−F). The six epidemiological clusters of patients were connected by a presumed SARS-CoV-2 transmission network [\(Fig.](#page-2-0) 1 and [Supplementary material\)](#page-6-9). On the evening of March 9, the index case, NJ01, in Cluster A wandered through the neighborhood without wearing a mask, potentially infecting cases NJ06 in Cluster B, NJ07 in Cluster C, and NJ38 in Cluster D, who were in the same public spaces at exactly the same time as NJ01 was. Before recognition and quarantine decisions were made, these secondary cases initiated subsequent transmission and formed the corresponding epidemiological clusters. The

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Figure 1. Schematic diagram of the assumed transmission of epidemiological Clusters A–F. *x*-axis: time; *y*-axis: epidemiological cluster. The solid arrows refer to direct epidemiologically confrmed transmission, and the dashed arrows indicate the putative direction of transmission. The same epidemiological clusters are within the blue dashed boxes. The same color indicates the same family.

initial infected individuals in Clusters E and F were most likely also infected by the index case, according to their geographical proximity to where NJ01 resided. However, unlike cases NJ06, NJ07, and NJ38, there was no additional evidence to support this conclusion, indicating the existence of undetected chains of transmission in the neighborhood via epidemiological methods.

Just 2 days after NJ06 was identifed, 20 cases in Cluster B were revealed simultaneously in routine screening tests, among which 14 were located in the same building as NJ06. Another characteristic of the outbreak was the transmission propensities in confned spaces, with obvious apartment building and family clustering [\(Supplementary material\)](#page-6-9).

#### **Phylogenetic analysis**

By using the Illumina sequencing platform, 61 high-quality wholegenome sequences were obtained, with an average sequencing depth of 5746.65 and a coverage depth of 95.58%−99.37% [\(Sup](#page-6-9)[plementary Table S1\)](#page-6-9). WGS revealed two closely related lineages, namely, BA.2.2.1 (52/61) and BA.2.2 (9/61). The minor branch BA.2.2 comprised the index sample sequence NJ01 and eight other sequences that were 100% similar to NJ01, including 1 sequence in Cluster A, 2 sequences in Cluster C, and 5 sequences in Cluster D.

As shown in [Fig.](#page-3-0) 2, all 61 successfully sequenced samples formed a compact clade, and these sequencing data were compatible with a single introduction of the Omicron virus and confrmed the linkage of onward case transmission in the community. The concentrated branch provided strong evidence for the epidemiologically suspected common source of the 6 clusters, characteristic of a unique signature, T14 034C. The additional general signature of Clusters B, E, and F was the mutation T6226C, with all the cases having this alteration, and 1 strain in Cluster A also contained this mutation. We identifed one additional consensus variation, T358A (NJ77), in Cluster B. For Clusters A and D, there was no common consensus alteration that was shared by all the strains. One strain in each of Clusters A and D presented a mutation at locus 12 655. The four patients from one family in Cluster D carried an extra signature combination of G2129A, T17863C, and A27691C, including one patient with a further mutation, C25611T. Compared with NJ01, Cluster D had the greatest variety and presented fve mutations at a consensus level, with one strain containing four substitutions, which was the most distant sequence from the index case NJ01. Unlike the other clusters, among which most patients were no more than tertiary cases, the four cases with 3−4 SNPs in Cluster D were quaternary and quinary cases. We assume that more generations are the main explanation for the greater SNP occurrence within this cluster.

#### **The presence and transmission of iSNVs**

The mutational sites associated with the consensus level of the SARS-CoV-2 genome data from this event were analyzed (reference genome: Wuhan-Hu-1, MN908947.3), and the results revealed that there were 82 nucleotide mutational sites [\(Fig.](#page-3-1) 3a and [Supplementary Table S2\)](#page-6-9), of which 14 034 was the unique mutational site of this outbreak. In Wuhan-Hu-1, the most frequent nucleotide substitutions (SNPs) were C > T (36.84%), G > A (11.94%), A > G (10.52%) and T > C (8.97%), and 68.27% of the substitutions were transitions. However, compared with the original strain of NJ01, all seven mutations at a consensus level were T > C (2 sequences),  $C > T$ ,  $G > A$ ,  $A > C$ ,  $T > G$  and  $T > A$ , and  $57.14\%$  (4/7)

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Figure 2. Phylogenetic analyses of SARS-CoV-2 genome sequences. A total of 4642 sequences were randomly selected from GISAID, and 61 sequences were selected for phylogenetic analysis. The zoomed-in section shows the strains in this study and those with close phylogenetic relationships (right). The sublineages are marked with different colors.

<span id="page-3-1"></span>

Figure 3. Nucleotide mutations in SARS-CoV-2 genomes. (a) Hierarchical clustering of nucleotide mutations (SNPs). The reference genome was Wuhan-Hu-1 (GenBank Accession No: MN908947.3). The color scale shows the degree of variation in each genome, from lowest (white, no mutation) to highest (blue, complete mutation). (b) Ratio of nonsynonymous to synonymous mutations (iSNVs). The reference genome was NJ01. (c) Distributions of synonymous and nonsynonymous mutations (iSNVs). The reference genome was NJ01. Pink indicates nonsynonymous mutations, and green indicates synonymous mutations.

of the substitutions were transitions. When we altered the reference (ancestor) strains, the nucleotide variation profle differed, possibly related to the length of the evolutionary time and the sample size.

Compared with NJ01, 74 identifed iSNV sites were distributed across genomic regions, with nonsynonymous iSNV sites accounting for 77.03% (57/74) and synonymous iSNV sites (17/74) accounting for 22.97%. In addition, 118 iSNVs occurred in the 61

<span id="page-4-0"></span>![](_page_4_Figure_1.jpeg)

Figure 4. Low-frequency and fixed mutations. (a) Allele frequency of the synonymous mutation  $T > C$  at site 6226. (b) Allele frequency of the synonymous mutation T>G at site 12,655. Orange and pink represent no mutation or low-frequency mutations, and blue and green represent complete mutations.

<span id="page-4-1"></span>individuals [\(Supplementary Table S3\)](#page-6-9). We further analyzed the iSNVs/kb in the 61 samples, and an overall relatively low density of iSNVs (0.065 iSNVs/kb) was identifed, which is comparable with the number of iSNVs identifed in a previous study (0.0041 mean iSNVs per 100 sites) [\(Lythgoe et](#page-7-7) al. 2021). The highest frequency of iSNVs/kb was identifed at S (0.26), followed by M (0.07) and E (0.07) [\(Fig.](#page-3-1) 3b), which was consistent with the frequency distribution of iSNVs in a previous report, indicating an uneven genomic distribution (Gu et [al. 2023\)](#page-6-10). The most abundant mutational patterns of iSNVs were  $T > A$  (34.75%),  $C > T$  (13.56%),  $G > T$  (11.02%),  $A > G$ (9.32%), T > C (6.78%), A > T (5.93%), and T > G (5.08%), and 33.05% of the iSNVs were transitions. The ratio of nonsynonymous to synonymous variants in all patients was 5.21 [\(Fig.](#page-3-1) 3c). Most (81.08%) iSNV sites were present in a single patient, whereas a small number of the iSNVs (18.92%) were present in at least two patients or were identical to consensus mutations. This suggested that most iSNVs are randomized mutations that occur at different positions rather than recurrent changes that occur frequently at specifc regions under selection pressure. In addition, 93.10% of the shared variants were nonsynonymous, and 6.9% were synonymous. We compared the iSNV sites associated with this outbreak with the 82 accumulated SNP sites associated with the Wuhan strain, and only 4 sites overlapped.

If the donor sequences with minor iSNVs had corresponding recipients, the transmission of the iSNVs could be observed regarding the emergence and fxation of variants in the recipients, or the fade of the iSNVs, in contrast, could be observed in some transmission pairs. The minor iSNV T6226C, with a frequency of 7.98%, was delivered from the index case to NJ03 in Cluster A and NJ06 in Cluster B, resulting in an increased frequency of 66.80% in NJ03 and the fxed substitution of T6226C in NJ06 in one generation of transmission. This substitution of T6226C was eventually present in 44 out of the 61 (72.1%) subjects [\(Fig.](#page-4-0) 4a). We also observed a low allele frequency (26.85%) at site T12 655 G in the index case, which increased to a higher frequency of 50.21% in NJ38 in Cluster D and was fxed (99.89%) in NJ05 in Cluster A [\(Fig.](#page-4-0) 4b). However, T12655G was confned to only two samples in this outbreak.

## **Bottleneck size estimation**

We calculated the transmission bottleneck size among the 11 epidemiologically defned donor−recipient transmission pairs via the beta binomial method. We identifed a stringent bottleneck size, which is consistent with previous studies [\(Lythgoe et](#page-7-7) al. 2021, <span id="page-4-2"></span>Wang et [al. 2021a,](#page-7-6) [Hannon et](#page-6-11) al. 2022). Finally, the maximum likelihood estimate for the overall transmission bottleneck size was 3. The transmission bottleneck sizes for the defned epidemiological pairs are shown in [Fig.](#page-5-0) 5a and [Supplementary Table S4.](#page-6-9) We observed how the minor iSNVs carried by the donor host were transmitted when one donor had multiple recipients [\(Fig.](#page-5-0) 5b). Our results revealed that the transmission bottleneck of SARS-CoV-2 was generally narrow, with most donor iSNVs not found in the recipients. However, the three relatively larger bottlenecks of 11, 23, and 23, which were derived from three transmission pairs with the original case as the donor, might have contributed to the diversity of the virus population during the outbreak.

## **Discussion**

Here, we reconstructed the transmission mode of SARS-CoV-2 in this community outbreak. At two polymorphic nucleotide sites (6226 and 12655), we analyzed the process of low-frequency iSNV fxation, which has great implications for understanding viral transmission and evolutionary directions. It was evident that some variants emerged as iSNVs when the infection started and became consensus level variations in the secondary cases. The fast fxation of the minor iSNV T6226C suggested that the subsequent mutations might offer the virus certain selective advantages when the virus spreads rapidly. Interestingly, the T12655G variant was lost in Cluster D. The higher frequency donor iSNVs were not seemingly more convenient to successful transmission, or this data might suggest the possible occurrence of the purifying selection of T12655G in some circumstances, which was a transversion instead of a transition. Moreover, if a variation could not be fxed rapidly within a single host, the opportunity for the variation to be passed and maintained in the virus population might be reduced, which was likely the case for the T12655G variation, despite the fact that NJ38 had four recipients. We did not observe cotransmission of the two variants T6226C and T12655G simultaneously, which is consistent with a narrow bottleneck.

Our results from the single-source community outbreak further support the low within-host diversity of the SARS-CoV-2 genome reported in previous studies [\(Markov et](#page-7-4) al. 2023). Compared with a proofreading exoribonuclease, SARS-CoV-2 is more replicative, which results in slow mutational accumulation. Compared with the index case, the most distant sequence presented only four SNPs, which could be explained by the properties of SARS-CoV-2 described above, including its prompt responses and

<span id="page-5-0"></span>![](_page_5_Figure_1.jpeg)

Figure 5. Estimated transmission bottleneck sizes and transmissions of intrahost variants. (a) Transmission bottleneck estimation via the approximate version and exact version of the beta-binomial sampling method. The bars show the means and 95% confdence intervals. (b) Minor iSNV transmission leads to diverse virus populations. The fnding of limited shared intrahost viral diversity was demonstrated. Alternative alleles were observed to survive, transmit, and fx. The transmission of minor iSNVs explains some of the fxed substitutions observed in the virus population during the outbreak. The pie charts show the frequency of iSNVs. The arrows show the direction of transmission of the case pairs. Different colors represent different bases.

short duration (16 days) of transmission. A narrow bottleneck size might play a role in reducing the population size and viral genetic diversity during transmission. However, compared with the results of the 26-day outbreak caused by the Delta virus, which also presented at most 4 nucleotide substitutions from the index sample (Li et [al. 2022\)](#page-6-7), the level of viral diversity over time was likely greater in this outbreak caused by the Omicron virus.

<span id="page-5-3"></span>The mutational properties of SARS-CoV-2 are infuenced by host cell deamination by apolipoprotein B mRNA editing catalytic polypeptide-like proteins (APOBEC), adenosine deaminase acting on RNA proteins (ADAR), and oxidation by reactive oxygen species (ROS). Generally, APOBEC deamination of cytosine results in  $C > U$ , ADAR deamination of adenine drives an increase in  $A > G$ , and ROS oxidation of guanine leads to G > U (along with reciprocal  $G > A$ ,  $U > C$ , and  $C > A$  mutations, respectively) [\(Azgari et](#page-6-12) al. [2021,](#page-6-12) [Mourier et](#page-7-8) al. 2021). Our results indicated that among the nucleotide substitutions in the SNPs, transitions ( $A \leftrightarrow G$  or  $C \leftrightarrow T$ ) were more prevalent than transversions. With respect to Wuhan-Hu-1, the proportion of the accumulated  $C > U$  substitution was <span id="page-5-6"></span><span id="page-5-5"></span><span id="page-5-4"></span><span id="page-5-2"></span><span id="page-5-1"></span>the highest, which was consistent with previous reports [\(Sexton](#page-7-9)  et [al. 2023\)](#page-7-9). However, the accumulated mutations in iSNVs across the genome might provide additional information regarding viral evolution and diversity. Xi et [al. \(2023\)](#page-7-10) reported that the main substitution of iSNVs was a transition (C > U), and [Armero et](#page-6-13) al. (2021) reported that the main substitution was a transversion  $(G > T)$ . In our study, the substitution was also dominated by a transversion  $(T > A)$ , but the types of transversions were inconsistent. [San et](#page-7-11) al. [\(2021\)](#page-7-11) reported that the most frequent iSNVs substitutions in the SARS-CoV-2 outbreak (CH1) in South Africa were A > G, C > U, U > C, and U > A. The most abundant mutational patterns of the iSNVs in the S gene in the report (San et [al. 2021\)](#page-7-11) were  $A > G$ ,  $C > U$ , and  $U > A$ , whereas our data presented the prevailing patterns of  $U > A$ ,  $A > G$ , and  $C > U$  in the S gene. These results suggest that there are differences in iSNV substitution patterns across different scenarios. The dominant iSNV substitution type was identifed as a T > A transversion in our SARS-CoV-2 genomic data, but the reasons for these observations are currently unknown apart from the small sample size, which requires further study. Mutations, such

as A > T and T > A transversions, are mediated through an as-yetuncharacterized mechanism, suggesting the complexity of host effects on virus sequence changes [\(Giorgio et](#page-6-14) al. 2020, [Simmonds](#page-7-12)  [and Schwemmle 2020\)](#page-7-12). Moreover, the different mutational types between the population-level SNPs and within-host-level iSNVs further demonstrates that most iSNV mutations in a genetic pool tend to be unfxed in the process of evolution. The ratio of nonsynonymous to synonymous variants was 5.21 in iSNVs, which was completely different from that in the SNP mutations, which also supports these observations.

<span id="page-6-22"></span><span id="page-6-18"></span>The size of the transmission bottleneck is a key factor in determining the possibility of the spread of a new within-host variation in a population [\(Zwart and Elena 2015\)](#page-7-13). Braun et al. reported that during acute SARS-CoV-2 infection, diversity within the host is low, transmission bottlenecks are narrow, and in-host variation is rarely transmitted [\(Braun et](#page-6-15) al. 2021). Bendall et al. identifed a per clade bottleneck of 1 for Alpha, Delta, and Omicron and 2 for non-VOCs, and that these tight bottlenecks refect the low diversity at the time of transmission [\(Bendall et](#page-6-16) al. 2023). They are similar in size to the transmission bottleneck in this study. Estimates of the viral bottleneck size might be infuenced by multiple factors, such as virus-specifc differences, viral dynamics, routes of infection, molecular interactions at the virus−host interface, and the stochastic evolutionary processes [\(McCrone et](#page-7-14) al. 2018, [Bendall](#page-6-16)  et [al. 2023\)](#page-6-16).

<span id="page-6-17"></span>The limitations of this study are presented in the [Supplemen](#page-6-9)[tary materials.](#page-6-9)

# Conclusions

The identifcation of a single viral lineage among all sequenced samples in this outbreak suggested a single introduction of the Omicron BA.2.2 virus into the community, which was transmitted through community contact. The low level of genetic variation in this outbreak is further supported by an estimated stringent transmission bottleneck. The mutations might have initiated at the iSNV level, with most changes being nonsynonymous at a low frequency before a small fraction of the minor iSNVs could fnally be fxed and identifed as synonymous SNPs. In addition, transversions were more common than transitions during iSNV accumulation, whereas transitions were more prevalent than transversions among the SNP nucleotide substitutions, possibly implying the outcomes of purifying selection during the emergence of a new variant at the population level.

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## Author contributions

Conceived and designed the experiments: J.D., M.H., and N.Z. Performed the experiments: L.G.Z., H.X.W., N.W., W.Y., X.X.D., Z.Y.W., X.Q.D., X.Y.M., and H.B.Z. Analyzed the data: N.Z., M.H., H.X.W., N.W., H.F.F., S.N.D., T.M., and Z.Z. Contributed analysis tools: H.X.W. Wrote the manuscript: N.Z. and J.D. Reviewed and revised: J.D. and L.G.Z.

## <span id="page-6-9"></span>Supplementary data

[Supplementary data](https://academic.oup.com/ve/article-lookup/doi/10.1093/ve/veae085#supplementary-data) is available at *VEVOLU Journal* online.

**Confict of interest:** None declared.

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## Data availability

The SARS-CoV-2 genome sequences in this study have been deposited in GenBank and the accession numbers were shown in [Supplementary Table S1.](#page-6-9)

## References

- <span id="page-6-3"></span>[Aggarwal D, Warne B, Jahun AS](#page-0-5) *et al*. Genomic epidemiology of SARS-CoV-2 in a UK university identifes dynamics of transmission. *Nat Commun* 2022;**13**:751.
- <span id="page-6-13"></span>[Armero A, Berthet N, Avarre JC.](#page-5-1) Intra-host diversity of SARS-Cov-2 should not be neglected: case of the state of Victoria, Australia. *Viruses* 2021;**13**:133.
- <span id="page-6-20"></span><span id="page-6-12"></span>[Azgari C,](#page-5-2) [Kilinc Z,](#page-5-2) [Turhan B](#page-5-2) *et al*. The mutation profle of SARS-CoV-2 is primarily shaped by the host antiviral defense. *Viruses* 2021;**13**:394.
- <span id="page-6-16"></span>[Bendall EE, Callear AP,](#page-6-17) [Getz A](#page-6-17) *et al*. Rapid transmission and tight bottlenecks constrain the evolution of highly transmissible SARS-CoV-2 variants. *Nat Commun* 2023;**14**:272.
- <span id="page-6-15"></span>[Braun KM,](#page-6-18) [Moreno GK,](#page-6-18) [Wagner C](#page-6-18) *et al*. Acute SARS-CoV-2 infections harbor limited within-host diversity and transmit via tight transmission bottlenecks. *PLoS Pathog* 2021;**17**:e1009849.
- <span id="page-6-0"></span>[Carabelli AM, Peacock TP, Thorne LG](#page-0-6) *et al*. SARS-CoV-2 variant biology: immune escape, transmission and ftness. *Nat Rev Microbiol* 2023;**21**:162–77.
- <span id="page-6-5"></span>[Chen S, Zhou Y, Chen Y](#page-1-0) *et al*. fastp: an ultra-fast all-in-one FASTQ preprocessor. *Bioinformatics* 2018;**34**:i884–i890.
- <span id="page-6-6"></span>[Danecek P, Bonfeld JK, Liddle J](#page-1-1) *et al*. Twelve years of SAMtools and BCFtools. *Gigascience* 2021;**10**:1–4.
- <span id="page-6-14"></span>[Giorgio SD,](#page-6-19) [Martignano F,](#page-6-19) [Torcia MG](#page-6-19) *et al*. Evidence for hostdependent RNA editing in the transcriptome of SARS-CoV-2. *Sci Adv* 2020;**6**:eabb5813.
- <span id="page-6-10"></span>[Gu H, Quadeer AA, Krishnan P](#page-4-1) *et al*. Within-host genetic diversity of SARS-CoV-2 lineages in unvaccinated and vaccinated individuals. *Nat Commun* 2023;**14**:1793.
- <span id="page-6-4"></span>[Gu H, Xie R, Adam DC](#page-0-7) *et al*. Genomic epidemiology of SARS-CoV-2 under an elimination strategy in Hong Kong. *Nat Commun* 2022;**13**:736.
- <span id="page-6-11"></span>[Hannon WW,](#page-4-2) [Roychoudhury P,](#page-4-2) [Xie H](#page-4-2) *et al*. Narrow transmission bottlenecks and limited within-host viral diversity during a SARS-CoV-2 outbreak on a fshing boat. *Virus Evol* 2022;**8**:veac052.
- <span id="page-6-1"></span>[Hong Q, Han WY, Li JW](#page-0-8) *et al*. Molecular basis of receptor binding and antibody neutralization of Omicron. *Nature* 2022;**604**:546–52.
- <span id="page-6-2"></span>[Komissarov AB, Safna KR, Garushyants SK](#page-0-9) *et al*. Genomic epidemiology of the early stages of the SARS-CoV-2 outbreak in Russia. *Nat Commun* 2021;**12**:649.
- <span id="page-6-8"></span>[Leonardl AS,](#page-1-2) [Weissman DB,](#page-1-2) [Greenbaum B](#page-1-2) *et al*. Transmission bottleneck size estimation from pathogen deep-sequencing data, with an application to human infuenza A virus. *J Virol* 2017;**91**:e00171–17.
- <span id="page-6-7"></span>[Li B, Deng A, Li K](#page-1-3) *et al*. Viral infection and transmission in a large, well-traced outbreak caused by the SARS-CoV-2 Delta variant. *Nat Commun* 2022;**13**:460.
- <span id="page-7-1"></span>[Lu J, Plessis L, Liu Z](#page-0-10) *et al*. Genomic epidemiology of SARS-CoV-2 in Guangdong Province, China. *Cell* 2020;**181**:997–1003.
- <span id="page-7-7"></span>[Lythgoe KA, Hall M, Ferretti L](#page-1-4) *et al*. SARS-CoV-2 within-host diversity and transmission. *Science* 2021;**372**:eabg0821.
- <span id="page-7-2"></span>[MacCannell T,](#page-0-11) [Batson J, Bonin B](#page-0-11) *et al*. Genomic epidemiology and transmission dynamics of Severe Acute Respiratory Syndrome Coronavirus 2 (SARS-CoV-2) in congregate healthcare facilities in Santa Clara County, California. *Clin Infect Dis* 2022;**74**:829–35.
- <span id="page-7-4"></span>[Markov PV, Ghafari M, Beer M](#page-1-5) *et al*. The evolution of SARS-CoV-2. *Nat Rev Microbiol* 2023;**21**:361–79.
- <span id="page-7-14"></span>[McCrone JT, Woods RJ, Martin ET](#page-6-20) *et al*. Stochastic processes constrain the within and between host evolution of infuenza virus. *Elife* 2018;**7**:e35962.
- <span id="page-7-8"></span>[Mourier T, Sadykov M, Carr MJ](#page-5-3) *et al*. Host-directed editing of the SARS-CoV-2 genome. *Biochem Biophys Res Commun* 2021;**538**:35–39.
- <span id="page-7-5"></span>[Price MN, Dehal PS, Arkin AP.](#page-1-6) FastTree: computing large minimum evolution trees with profles instead of a distance matrix. *Mol Biol Evol* 2009;**26**:1641–50.
- <span id="page-7-11"></span>[San JE, Ngcapu S, Kanzi AM](#page-5-4) *et al*. Transmission dynamics of SARS-CoV-2 within-host diversity in two major hospital outbreaks in South Africa. *Virus Evol* 2021;**7**:veab041.
- <span id="page-7-9"></span>[Sexton NR, Cline PJ, Gallichotte EN](#page-5-5) *et al*. SARS-CoV-2 entry into and evolution within a skilled nursing facility. *Sci Rep* 2023;**13**:11657.
- <span id="page-7-12"></span>[Simmonds P, Schwemmle M.](#page-6-21) Rampant C→U hypermutation in the genomes of SARS-CoV-2 and other Coronaviruses: causes and consequences for their short- and long-term evolutionary trajectories. *mSphere* 2020;**5**:e00408–20.
- <span id="page-7-6"></span>[Wang D, Wang Y, Sun W](#page-1-7) *et al*. Population bottlenecks and intra-host evolution during human-to-human transmission of SARS-CoV-2. *Front Med Lausanne* 2021a;**8**:585358.
- <span id="page-7-3"></span>[Wang Y, Wang D, Zhang L](#page-0-12) *et al*. Intra-host variation and evolutionary dynamics of SARS-CoV-2 populations in COVID-19 patients. *Genome Med* 2021b;**13**:30.
- <span id="page-7-10"></span>[Xi B,](#page-5-6) [Zeng X,](#page-5-6) [Chen Z](#page-5-6) *et al*. SARS-CoV-2 within-host diversity of human hosts and its implications for viral immune evasion. *mBio* 2023;**14**:e0067923.
- <span id="page-7-0"></span>[Zhao N, Zhou N, Fan HF](#page-0-13) *et al*. Mutations and phylogenetic analyses of SARS-CoV-2 among imported COVID-19 from abroad in Nanjing, China. *Front Microbiol* 2022;**13**:851323.
- <span id="page-7-13"></span>[Zwart MP,](#page-6-22) [Elena SF.](#page-6-22) Matters of size: genetic bottlenecks in virus infection and their potential impact on evolution. *Annu Rev Virol* 2015;**2**:161–79.

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