

1 **Severe Acute Respiratory Syndrome Coronavirus 2 (SARS-CoV-2) Household**
2 **Transmission during the Omicron Era in Massachusetts: A Prospective, Case-Ascertained**
3 **Study using Genomic Epidemiology**

4
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31

32 **Key Points:** When community transmission of SARS-CoV-2 is high, distinguishing household
33 transmissions from independent introductions is difficult with either epidemiologic or genomic
34 data alone. Here, we conducted daily nasal sampling with genomic sequencing to understand the
35 dynamics of viral transmission within households.

36

37

38 **Abstract:**

39

40 Background:

41 Households are a major setting for SARS-CoV-2 infections, but there remains a lack of
42 knowledge regarding the dynamics of viral transmission, particularly in the setting of widespread
43 pre-existing SARS-CoV-2 immunity and evolving variants.

44

45 Methods:

46 We conducted a prospective, case-ascertained household transmission study in the greater
47 Boston area in March-July 2022. Anterior nasal swabs, along with clinical and demographic
48 data, were collected for 14 days. Nasal swabs were tested for SARS-CoV-2 by PCR. Whole
49 genome sequencing was performed on high-titer samples.

50

51 Results:

52 We enrolled 33 households in a primary analysis set, with a median age of participants of 25
53 years old (range 2-66); 98% of whom had received at least 2 doses of a COVID-19 vaccine.
54 58% of households had a secondary case during follow up and the secondary attack rate (SAR)
55 for contacts infected was 39%. We further examined a strict analysis set of 21 households that
56 had only 1 PCR+ case at baseline, finding an SAR of 22.5%. Genomic epidemiology further
57 determined that there were multiple sources of infection for household contacts, including the
58 index case and outside introductions. When limiting estimates to only highly probable
59 transmissions given epidemiologic and genomic data, the SAR was 18.4%.

60

61 Conclusions:

62 Household contacts of a person newly diagnosed with COVID-19 are at high risk for SARS-
63 CoV-2 infection in the following 2 weeks. This is, however, not only due to infection from the
64 household index case, but also because the presence of an infected household member implies
65 increased SARS-CoV-2 community transmission. Further studies to understand and mitigate
66 household transmission are needed.

67

68

69 **INTRODUCTION**

70

71 In March 2022, the SARS-CoV-2 Omicron variant BA.2 and its descendants caused multiple
72 outbreaks across the greater Boston area of Massachusetts¹. More than 95% of the population of
73 Massachusetts at that time had received at least one dose of a COVID-19 vaccine, and a large
74 number of individuals had been infected with the Omicron BA.1 variant only a few months
75 prior¹. Despite this presence of partial population immunity, there were over 200,000 new
76 COVID-19 cases reported in Massachusetts between March and July 2022, coincident with the
77 dropping of mask requirements and a reduction in social distancing policies.

78

79 Throughout the COVID-19 pandemic, households have been a major setting for SARS-CoV-2
80 transmission². A meta-analysis of 135 studies published in 2022 found that the secondary attack
81 rate (SAR) – the risk of transmission from index case to household contact – of exposed
82 household contacts was 30-36% during the Alpha and Delta SARS-CoV-2 waves and 43%
83 during the early (BA.1) Omicron period². Factors associated with transmission risk were the
84 vaccine status of the exposed contact, household density (i.e., the number of people sleeping in
85 the same room), and immunological factors such as the magnitude of cross-reactive memory T
86 cells to SARS-CoV-2 antigens³⁻⁵. In general, the SARs reported in households, and other
87 residential settings⁶, have been far higher than reported in other settings such as schools, where a
88 SAR of 2.8% was reported for exposed students in 10 Massachusetts schools during the Delta
89 wave⁷.

90

91 Despite the large number and range of household studies performed to date, there remains a lack
92 of precision and detail regarding the dynamics of SARS-CoV-2 household transmission. These
93 studies are each individually small in size, and most lack careful characterization on the genomic
94 level. This uncertainty is particularly important in the increasingly common scenario where there
95 is (1) widespread pre-existing SARS-CoV-2 immunity, either from vaccination or infection, (2)
96 emergence of new SARS-CoV-2 strains that are partially immune evasive, and (3) few infection
97 control precautions in home and community environments. Knowing the risk of household
98 transmission in this scenario, as well as identifying factors that can predict lower SARs, would
99 enhance our ability to counsel patients appropriately and meaningfully reduce SARS-CoV-2
100 infections in households.

101

102 To address this research gap, we conducted a household SARS-CoV-2 transmission study in the
103 greater Boston area in March-July 2022 in which we used clinical, demographic, viral kinetic,
104 and genomic data for high-resolution analyses of SARS-CoV-2 transmission dynamics.

105

106 **METHODS:**

107

108 We conducted a prospective, observational, case-ascertained transmission study of household
109 contacts of index SARS-CoV-2 cases identified in the greater Boston and Chelsea areas of
110 Massachusetts in the United States. The primary recruitment pathway was via ambulatory
111 COVID-19 testing sites associated with Beth Israel Deaconess Medical Center (BIDMC).

112

113

114 **Ethics**

115 The BIDMC Committee on Clinical Investigation, its Institutional Review Board (IRB),
116 approved the study protocol (#2022P000021). Consent procedures were completed via
117 phone/video conferencing or in-person. All enrolled participants provided verbal informed
118 consent. Participants who met applicable IRB guidelines for provision of assent underwent an
119 age-appropriate assent process; informed consent for study participation was obtained from each
120 participant's parent or legal guardian before any study-specific procedures were performed.
121 Sequencing of SARS-CoV-2-positive specimens was covered under protocol #1612793224,
122 reviewed and approved by the Massachusetts Institute of Technology (MIT) IRB.

123

124 **Study Population**

125 An index case was eligible for inclusion if the participant (1) had a positive SARS-CoV-2 test
126 either by rapid diagnostic assay or RT-PCR no more than 5 days prior to enrollment and had no
127 more than 5 days of acute respiratory illness symptoms prior to testing, and (2) lived, and had
128 plans to live in his/her household for the follow-up period of 14 days, and (3) was not
129 hospitalized and had not been hospitalized since the date of illness onset, and (4) was at least 2
130 years old. An index case was excluded from the study if the participant did not live in a
131 household (e.g., lived alone or in a congregate setting), or if they reported that any other person
132 in the household had an acute respiratory illness or tested positive for SARS-CoV-2 in the 7 days
133 before the test date or illness onset date of the index case.

134

135 A household contact was eligible for inclusion if the participant (1) routinely slept (at least half
136 of the nights in the last month) in the same household as the index case, and (2) slept in the

137 household at least once between 1 day prior to the earliest of the index case’s illness onset or
138 positive test date and (3) had plans to live in the household for the follow-up period, and (4) was
139 at least 2 years old.

140

141 **Respiratory Specimen Collection**

142 Each enrolled index case and household member self-collected an anterior nasal swab
143 (Rhinostics dry swab in a sterile tube; <https://rhinostics.com/>) on each day of the 14-day follow-
144 up period. The swab was self-collected regardless of whether the individual had acute respiratory
145 illness signs or symptoms. Samples were dropped off by the participants at the BIDMC Clinical
146 Research Center or the Chelsea clinic. A subset of participants who were treated with
147 nirmatrelvir-ritonavir were asked to extend the follow-up period and continue self-swabbing for
148 an additional 7 days in order to monitor for potential virologic rebound⁸.

149

150 **Questionnaires**

151 At enrollment, each consenting household member and index case, or his/her parent/guardian,
152 was asked to provide information on participant demographics, recent exposures to COVID-19,
153 presence of high-risk conditions, prior and current symptoms of COVID-19, COVID-19
154 vaccination status, household characteristics, interactions with other enrolled and non-enrolled
155 household members and people outside the home, and other social or medical history, including
156 other vaccination history, as deemed appropriate. An optional follow-up questionnaire was
157 administered to participants on days 7 and 14.

158

159

160 **SARS-CoV-2 Viral Load Quantification**

161 Viral loads were measured with the Quaris SARS-CoV-2 Assay, a real-time reverse
162 transcription polymerase chain reaction (rRT-PCR) test, using the Luna Probe One-Step RT-
163 qPCR Kit (No ROX) [NEB E3007]⁹. The SARS-CoV-2 primer and probe set detects RNA from
164 the SARS-CoV-2 N1 and RdRP genes, and uses the human RNase P gene as a positive control.
165 When received by the laboratory, samples were rehydrated with 300 µl phosphate buffered saline
166 (PBS), inactivated at 65°C, and subsequently used directly as input for the Quaris assay without
167 extraction. rRT-PCR was performed on an Applied Biosystem QuantStudio 7 instrument
168 (software version 1.7). Liquid handling was automated using either the Tecan Fluent 1080, the
169 Hamilton Star, or the Multidrop combi dispenser. N1 gene cycle threshold (Ct) values are
170 reported. Viral rebound was defined as at least 2 negative (Ct \geq 35) PCR results followed by at least
171 2 positive (Ct $<$ 35) results.

172

173 **SARS-CoV-2 Whole Genome Sequencing**

174 Anterior nasal swabs that were positive for SARS-CoV-2 with Ct values of maximally 32 via the
175 Quaris assay were sequenced as previously described¹⁰. Briefly, following inactivation with
176 Buffer AVL, RNA was extracted from the samples using the MagMAX mirVana Total RNA
177 Isolation Kit for the Kingfisher Flex (Thermo Fisher #A27828) according to the manufacturer's
178 instructions. The ARTIC v4.1 primer set was used to amplify SARS-CoV-2 genetic material,
179 from which Illumina DNA Prep sequencing libraries were prepared and sequenced on the
180 NextSeq 550¹¹.

181

182

183 **SARS-CoV-2 Genomic Data Analysis**

184 Sequencing reads were demultiplexed, filtered to remove adapter and contaminant sequences,
185 depleted of reads mapping to the human genome, and assembled by alignment to the reference
186 sequence NC045512.2 via the viral-ngs v2.1.33 pipeline¹². The following optional inputs were
187 used with the assemble_refbased workflow to accommodate amplicon-based sequencing:
188 major_cutoff = 0.5, min_coverage = 20, skip_mark_dupes = TRUE, and trim_coords_bed =
189 "gs://pathogen-public-dbs/v1/amplicon_primers-ARTICv4.1_NC_045512.2.bed".

190
191 Lineages were assigned to viral genomes using Pango v4.1.3 pango-data v1.17¹³. Consensus
192 single nucleotide variants (SNVs) were determined after removing ambiguous sites and sites
193 prone to amplicon sequencing error¹⁴. Intrahost single nucleotide variants (iSNVs) were called
194 using LoFreq and were filtered as follows: (i) masking of known problematic sites in SARS-
195 CoV-2 genome, (ii) site read depth of minimally 100; (iii) allele frequency of minimally 3%; and
196 (iv) no evidence of strand bias (via Fisher's exact test with $p > 0.05$)^{11,15}.

197

198 **Transmission Analysis**

199 To infer the relatedness of cases within a household, the most complete genome (i.e., the genome
200 with the highest percentage of unambiguous sites) was used for each person with a minimum
201 unambiguous genome length of 15,000 bp. The genetic (SNV) distance between pairs of cases was
202 used alongside the serial interval, viral kinetics, iSNV information, and test status of other
203 individuals at baseline to classify households into transmission categories. All pairs of cases within
204 each household were assessed, excluding those inconsistent with the longitudinal testing data.

205

206 Transmissions were categorized as highly probable, possible, or unlikely. Pairs with a genetic
207 distance of less than 2 SNVs and an iSNV in a putative donor that reached consensus in the putative
208 recipient (i.e., transmission of a minor variant through a tight transmission bottleneck) were
209 considered highly probable^{16,17}. An index-contact pair in the strict analysis set (i.e., from a
210 household with a single infected participant and documented PCR- contacts at baseline) with a
211 genetic distance of less than 3 SNVs and a serial interval of less than 7 days were also considered
212 highly probable transmissions. Pairs with a genetic distance of less than 3 SNVs and a serial
213 interval of less than 7 days, but without iSNV support, were categorized as a possible transmission,
214 though we cannot rule out a non-household recent common ancestor (i.e., a shared exposure)^{18,19}.
215 Pairs with a genetic distance of 3 or more SNVs or a serial interval of minimally 7 days were
216 considered unlikely. Highly probable and possible transmission links were plotted.^{20,21}

217

218 **Phylogenetic Analysis**

219 Contextual genomes (10 BA.1 sequences each from Massachusetts and the United States, and 50
220 BA.2 sequences each from Massachusetts and the United States, isolated between 2022-02-01 and
221 2022-08-01) were downloaded from NCBI GenBank. These sequences, along with the most
222 complete genome assembled per study participant (of minimally 15,000 bp), were aligned to the
223 reference sequence (NC_045512.2) using Nextclade v.2.14.1²². A phylogenetic tree was estimated
224 using IQ-TREE v.2.2.2.6²³ and was visualized and annotated using ggtree v.3.8.2²⁴ in R v.4.3.1.

225

226

227 **RESULTS**

228

229 **Screening, Enrollment, and Follow-up**

230 Enrollment began on March 3, 2022 and continued until July 9, 2022, after local SARS-CoV-2
231 case counts had declined¹. We enrolled 38 households containing 38 index cases and 77
232 household contacts; Figure 1. One household was subsequently found to be ineligible and 4
233 households did not complete 14 days of follow up. The remaining 33 households (33 index cases
234 and 66 household contacts) constituted our primary analysis set; 85% of these households
235 (28/33) had all household members participate. Of the 33 households in the primary analysis set,
236 3 households had an index case that was PCR- at the time of first research swab, and 9
237 households had at least one household contact that were PCR+ at the time of first research swab.
238 The remaining 21 households (21 index cases and 40 PCR- household contacts) constituted our
239 strict analysis set. The median number of persons per household in the primary analysis set was
240 3.5 (range, 2-5; Supplementary Table 2). The median house size was 1400 square feet (range,
241 740-3300; Supplementary Table 2).

242

243 **Study Population**

244 Demographic and clinical characteristics of index cases and household contacts in the primary
245 analysis set are shown in Table 1 and Supplemental Table 1. The median age was 25 years
246 (range, 5-64) for index cases and 39 years (range, 2-66) for household contacts. 23% of
247 participants were children in elementary or middle school. Participants were predominantly
248 White and Non-Hispanic. 81% of participants reported having no medical conditions. The most
249 common reported medical conditions were asthma (12%), autoimmune or immune system

250 disease (8%), and high blood pressure (4%). 10% of participants reported having COVID-19 at
251 some point prior to the study (though symptom- and testing-based ascertainment bias is likely).
252 98% of participants received at least 2 vaccine doses. The median duration between most recent
253 vaccination or most recent infection was 160 days (range 0-307).

254

255 **SARS-CoV-2 Infections**

256 Of the 33 households in the primary analysis set, 19 (58%) had a household contact who tested
257 positive by PCR during follow up ([Figure 2A](#) and [Table 2](#)). Of the 66 household contacts in the
258 primary analysis set, 26 tested positive, indicating a putative SAR of 39%; 11 of these cases were
259 detected on day 1 of swabbing. If limiting analysis to the 21 households in the strict analysis set,
260 9 (43%) households had a new incident infection during follow up, corresponding to 9 infections
261 out of 40 household contacts, or a putative SAR of 22.5%.

262

263 In the primary analysis set of 33 households, the median minimal Ct - corresponding to peak
264 viral load - was 25.65 for index cases and 23 for infected household contacts ([Supplemental](#)
265 [Table 3](#)). Median duration of viral shedding was 6.5 days and 8 days for index cases and
266 contacts, respectively, and the median time to positive SARS-CoV-2 test from index diagnosis
267 date was 3 days. The lower viral load and decreased duration of shedding for index cases is most
268 likely due to the fact that cases were detected partway through infection. Eleven participants
269 reported taking nirmatrelvir-ritonavir; 3 participants had viral rebound ([Supplemental Figure 1A:](#)
270 [MPO-02, BQE-01 and BQE-02](#))⁸.

271

272

273 **SARS-CoV-2 Sequencing**

274 For the primary analysis set, approximately 1300 total anterior nasal swab samples were
275 collected and analyzed via the rRT-PCR Quaris assay. 181 of these samples, from 48 unique
276 individuals across 26 unique households, had a diagnostic Ct under 32 (mean = 30.1) and were
277 thus subject to genomic sequencing. 178/181 (98.3%) samples had a nonzero unambiguous
278 assembly length with a median length of 29,321bp. 143 samples, which came from 44 unique
279 individuals among 24 unique households, produced partial genomes of at least 15,000 bp in
280 length (Supplemental Table 4). 15 households yielded partial genomes from multiple individuals
281 within the household. The vast majority of the sequences were BA.2 descendants, consistent with
282 national trends (Figure 2B), though a BA.1 sequence was collected early in enrollment.

283
284 Focusing first on analyzable households in the strict analysis set (N=6), we found that four
285 households had viral sequences that were either identical between index and secondary cases or
286 differed by only 1-2 SNVs (Figure 3A, Supplemental Table 5). In these cases, transmission from
287 index to secondary case was considered highly probable. In two households, we identified
288 significant viral variation between sequences isolated from the index and secondary contacts,
289 strongly suggesting that the secondary cases were independent introductions (Figure 3B). In
290 household XOA, the index case was infected with a BA.2.13 variant, while the contact was
291 infected with BA.2.12.1; there was a 13 SNV difference between sequences. In household
292 WMD, the index case was infected with BA.2.12.1, and the contact was infected with BA.2;
293 there was a 20 SNV difference between sequences. (Of the 3 remaining households with
294 secondary cases in the strict analysis set (AXB, JDU and NKF), sequences were not available or
295 couldn't be analyzed; viral kinetic curves for these households are in Figure 3C). When

296 excluding the 2 household contacts that were infected outside of the household, the SAR among
297 individual household contacts in the strict analysis set was 18.4% ([Table 2](#)).

298
299 Analyzing transmission networks among all the households in the primary analysis set revealed
300 several interesting patterns. In 5 households, there were clusters of infections (2-3 per household)
301 that were all genetically linked to the index case ([Figure 4A](#) (a representative example), and
302 [Supplemental Figure 1A](#)). In these households, there were 0 SNVs different between index and
303 contact sequences, but the close overlap in diagnosis dates suggests that either a shared common
304 exposure or intra-household transmission was possible. In 3 households, there were two distinct
305 clusters of infections detected ([Figure 4B](#) (a representative example), and [Supplemental Figure](#)
306 [1B](#)). In these households, the index case was infected with a virus that was 3-4 SNVs different
307 than the viruses that circulated in the rest of the household. In 1 household ([Figure 4C](#)), there
308 was evidence that the index case was co-infected with 2 contemporaneously circulating strains
309 (BA.2.1.12 and BA.2.10) while the contact was infected with solely BA.2.1.12; given the close
310 diagnosis dates, this could be explained by either a shared social network or transmission with a
311 bottleneck.

312

313 **Potential Predictors of Transmission**

314 To explore potential predictors of transmission between an index case and household contact, we
315 examined the 7 household contacts where transmission from the index was highly likely
316 compared to the 28 participating contacts that remained uninfected. Using Wilcoxon rank sum
317 and Fisher's exact tests ([Table 3](#)), we found that there was no association between infection
318 status and the contact's prior COVID-19 vaccination, number of prior vaccines received, history

319 of prior infection, days since vaccination and/or infection, age or sex assigned at birth. There was
320 also no association between infection status and the associated index case's prior COVID-19
321 vaccine status, minimum Ct value, or duration of SARS-CoV-2 shedding, and no association
322 between infection status and the number of persons in the household or and square footage. The
323 small sample size and homogeneity of many of these variables (e.g., vaccine history) limited the
324 power of our analysis to detect predictors of transmission risk.

325

326 **DISCUSSION**

327

328 Here we studied the transmission dynamics of SARS-CoV-2 within households using
329 prospective daily PCR surveillance, clinical and demographic data, and genomic epidemiology.
330 Our study is well-positioned to reflect the transmission dynamics of households consisting of
331 relatively young, healthy individuals with pre-existing immunity to SARS-CoV-2. It was
332 conducted during a wave of Omicron BA.2 and its sub-lineages. Our study population consisted
333 primarily of families with 2-5 members; 23% of our participants were children in elementary or
334 middle school. Participants were highly vaccinated, having received a median of 3 COVID-19
335 vaccines. Only 10% had a known prior COVID-19 diagnosis and the population was overall very
336 healthy.

337

338 Our study found that the risk of SARS-CoV-2 in exposed households is very high, consistent
339 with previous reports. In our primary analysis set, we found that 58% of enrolled households
340 went on to have a second SARS-CoV-2 case in the household over the next 2 weeks. Nearly a
341 third of households had a positive secondary case identified on the very first day of testing. At

342 the individual level, we found that 39% of household contacts tested positive for SARS-CoV-2
343 during follow up. Following the infection of a household contact, putatively negative household
344 members must make decisions around travel and attending school or work. Here, we provide
345 data that could inform this value-based decision.

346
347 We further aimed to more rigorously estimate the risk of SARS-CoV-2 transmission directly
348 from an index case, performing a strict analysis including only households that had one
349 confirmed PCR+ index case and only PCR- household contacts at the beginning of surveillance.
350 In this analysis, we identified 9 cases among 40 household contacts, or a SAR of 22.5%. Using
351 genomic epidemiology, we then excluded 2 cases as these were likely acquired outside of the
352 household. We thus determined that SAR was 18.4%. Our study was conducted when multiple
353 BA.2 descendants were circulating, and this genetic diversity improved our ability to rule out
354 putative transmission events.

355
356 Using genomic epidemiology across all the households, we found that the infectious source of
357 secondary cases was varied. The most common source of infection was the index case, but other
358 sources included an imported case (outside the household), shared exposures with the index, or
359 other infected contacts within the home. Our findings, particularly evidence of shared exposures
360 and imported cases, highlight that infection within a household serves as a proxy for broader risk
361 for community transmission, emphasizing the importance of maintaining vigilant public health
362 measures both inside and outside of the home. More public health attention should be focused on
363 mitigating this risk via vaccination and therapeutic advances, enhanced and early case detection
364 and isolation, and non-pharmaceutical interventions such as masking and ventilation.

365
366 SAR estimates have varied considerably across multiple studies, due to varying study designs,
367 populations, and circulating SARS-CoV-2 variants. During the Alpha and Delta waves, the SAR
368 for exposed household contacts was reported between 30-36%, rising to 43% during the early
369 (BA.1) Omicron period². Here we report that during a BA.2 wave (and its descendants), the SAR
370 was 39% using a larger primary set of households, 22.5% with a strict set of households, and
371 18.4% when further incorporating genomic data. This lower estimate using genomic data is
372 likely a more accurate reflection of the true risk of household exposure.

373
374 Our small sample size substantially limited our power to assess predictors of transmission,
375 especially because prior COVID-19 vaccination was near universal in our study cohort. Given
376 the complexity of estimating the magnitude of pre-existing SARS-CoV-2 immunity by history
377 alone, particularly in the context of both infection and prior vaccines, future household
378 transmission studies would benefit from larger cohorts and baseline immunologic assessments of
379 humoral, cellular and mucosal immune responses.

380
381 In summary, we determined that the risk of household transmission of SARS-CoV-2 is very
382 high, even when using genomic epidemiology to exclude imported cases. Further interventions to
383 block household transmission should be studied, especially in the now-common scenario when
384 population immunity and vaccine coverage are high but viral variants are increasingly immune
385 evasive.

386
387

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404

405 **Conflicts of Interest**

406 P.C.S. is a co-founder of, shareholder in, and scientific advisor to Sherlock Biosciences, Inc and
407 Delve Bio; she is also a Board member of and shareholder in Danaher Corporation. P.C.S. has
408 filed IP related to genome sequencing and analysis. The authors declare no other conflicts of
409 interests.

410

411 **FIGURE LEGENDS**

412

413 **Figure 1. Trial profile.**

414

415 **Figure 2. Household diagram.** (A) Individual households are labeled with a 3-letter identifier
416 and represented with grey boxes. Households in both the primary and strict analysis sets are
417 shown. Each member of the household is shown within the grey box, with their outcome color-
418 coded as described in the legend. (B) Phylogenetic map of positive samples.

419

420 **Figure 3. Viral load curves and transmission plots by household in the strict analysis set.**

421 (A) Households where transmission was determined to be highly probable are shown. (B)
422 Households where transmission was determined to be unlikely are shown. (C) Households that
423 did not yield sufficient sequencing data are shown.

424

425 **Figure 4. Representative viral load curves and transmission plots from primary analysis**

426 **set.** (A) A representative household is shown where either a shared exposure (i.e., social
427 network) exists or within-household transmission has occurred, as all cases are genetically linked
428 to the index case. (B) A representative household is shown where two separate infection clusters
429 were identified. (C) A household is shown where a putative co-infection was identified in the
430 index case.

431

432 **Supplemental Figure 1. Additional viral load curves and transmission plots by household in**
433 **the primary analysis set.** Households are shown where either a shared exposure exists or

434 possible transmission has occurred, as all cases are genetically linked to the index case.

435 Households are shown where two separate infection clusters were identified.

436

437

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TABLES**Table 1. Baseline Characteristics of Study Population**

Characteristic	All Participants (N=99)	Index Cases (N=33)	Contacts (N=66)
Age (Median, Min-Max)	27 (2-66)	25 (5-64)	39 (2-66)
Sex assigned at birth (N, %) –			
Male	44 (48.4)	14 (43.8)	30 (50.9)
Female	47 (51.7)	18 (56.3)	29 (49.2)
Missing	8	1	7
Race (N, %) –			
American Indian or Alaskan Native	10 (11.0)	3 (9.4)	7 (11.9)
Asian	2 (2.2)	1 (3.1)	1 (1.7)
Black or African American	0	0	0
Native Hawaiian or Other Pacific Islander	0	0	0
White	79 (86.8)	28 (87.5)	51 (86.4)
Multiple	0	0	0
Prefer Not to Report	0	0	0
Other	0	0	0
Missing	8	1	7
Ethnicity (N, %) –			
Hispanic or Latino / Latinx	3 (3.3)	1 (3.1)	2 (3.4)

Not Hispanic or Latino / Latinx	88 (96.7)	31 (96.9)	57 (96.6)
Missing	8	1	7
Body Mass Index (Median, Min/Max)	22.9 (14.1-7.2)	23.0 (16.1-37.1)	22.7 (14.1-47.2)
Missing	19	9	10
Medical Conditions (N, %)			
None	69 (81.2)	21 (72.4)	48 (85.7)
Cancer	0	0	0
Diabetes	1 (1.2)	1 (3.5)	0
Asthma or wheezing	10 (11.8)	5 (17.2)	5 (8.9)
COPD/Emphysema	0	0	0
High blood pressure	3 (3.5)	1 (3.5)	2 (3.6)
Coronary artery disease	0	0	0
Congestive heart failure	0	0	0
Peripheral artery disease	0	0	0
Other*	2 (2.4)	1 (3.5)	1 (1.8)
Missing	14	4	10
Autoimmune or Immune System Diseases, Any** (N, %)	7 (8.2)	1 (3.7)	6 (10.3)
Missing	14	6	8
Prior Diagnosis of COVID-19 (N, %)	9 (9.5)	1 (3.2)	8 (12.5)
Missing	4	2	2

Days between most recent diagnosis and enrollment (Median, Min-Max)	59 (18-780)	780	57 (18-462)
Hospitalized for COVID-19 (N, %) – <i>missing 1</i>	0	0	0
Prior Receipt of a COVID-19 Vaccine (N, %) – <i>missing 2</i>	95 (97.9)	32 (100)	63 (96.9)
Number of doses (Median, Min-Max)	3 (2-4)	3 (2-4)	3 (2-4)
Days between most recent COVID-19 vaccination and enrollment (Median, Min-Max) – <i>missing 4</i>	165 (1-308)	165 (48-308)	165 (1-307)
Days between most recent diagnosis OR most recent COVID-19 vaccination (whichever is more recent) and enrollment (Median, Min-Max)	160 (0-308)	164.5 (0-308)	160 (1-307)
Missing	2	1	1

*Reported by participant: “heart aneurysm” (1); history of stroke (2)

**Reported by participant: “irritable bowel syndrome, eczema and allergies” (1); “vitiligo” (1); “diverticulosis” (1); “Reynaud’s disease” (1)

Table 2. SARS-CoV-2 Secondary Attack Rates

	# Events	Total Households	Total Contacts	SAR (%)
Primary Analysis Set				
Households with 2 ^o cases	19	33	-	57.6
Individual 2 ^o cases	26	-	66	39.4
Strict Analysis Set				
Households with 2 ^o cases	9	21	-	42.9
Households with 2 ^o cases, excluding households with outside infection	7	19	-	36.8
Individual 2 ^o cases	9	-	40	22.5
Individual 2 ^o cases, excluding individuals with outside infection	7	-	38	18.4

Table 3. Household Contact Characteristics by Infection Status (Strict Analysis Set), Excluding 2⁰ Cases with Outside Infections

	Infected Contact (N=7)	Not Infected Contact (N=28)	p-value
Characteristic of Household Contact			
Age (Median, Min-Max)	46 (13-50)	28.5 (10-64)	0.76 ^a
Male sex assigned at birth (N, %)	2 (33.3)	13 (59.1%)	0.37 ^b
Missing	1	6	
Number of COVID-19 vaccines received (Median, Min-Max)	3 (2-3)	3 (2-4)	1.00 ^b
Missing	0	1	
Days from last infection/vaccination (Median, Min-Max)	146 (119-193)	138 (-1-197)	0.45 ^a
Missing	0	6	
Characteristic of Associated Index Case			
Lowest Ct value (Median, Min-Max)	27.8 (18.2-35)	25 (15.9-33.9)	0.19 ^a
Duration of shedding in days (Median, Min-Max)	7 (3-9)	8 (1-15)	0.41 ^a
Missing	0	0	
Characteristic of Associated Household			
Number of persons in household (Median, Min-Max)	4 (2-4)	4 (2-4)	0.10 ^b
Missing	0	1	
Square footage (Median, Min-Max)	1140 (740-3300)	1000 (740-3300)	0.59 ^a
Missing	2	15	
a. Wilcoxon rank sum test			
b. Fisher's Exact			

SUPPLEMENTAL TABLES

Supplemental Table 1. Additional Baseline Data

Characteristic	All Participants (N=99)	Index Cases (N=33)	Contacts (N=66)
Currently Working / Employment (N, %) – missing 13			
Yes	57 (66.3)	18 (69.2)	39 (65.0)
No	29 (33.7)	8 (30.8)	21 (35.0)
Missing	13	7	6
Student (N, %) – missing 9			
Yes	32 (35.6)	13 (43.3)	19 (31.7)
No	58 (64.4)	17 (56.7)	41 (68.3)
Missing	9	3	6
If yes (N=32), level (N, %)			
Elementary	11 (34.4)	5 (38.5)	6 (31.6)
Middle School	12 (37.5)	5 (38.5)	7 (36.8)
High School	5 (15.6)	2 (15.4)	3 (15.8)
Community College	0	0	0
College or University	4 (12.5)	1 (7.7)	3 (15.8)
Currently Uses eCigarettes/Vape (N, %) – missing 9	1 (1.1)	0	1 (1.6)
Currently Smokes Cigarettes (N, %) – missing 9	1 (1.1)	0	1 (1.6)

History of Smoking Cigarettes (N, %) – missing 10	11 (12.4)	3 (10.3)	8 (13.3)
If yes, packs per day (N, %)			
0.5	7 (63.6)	1 (33.3)	6 (75.0)
1.0	4 (36.4)	2 (66.7)	2 (25.0)
1.5	0	0	0
2.0	0	0	0
2.5	0	0	0
3 or more	0	0	0
If yes, how many years (N, %)			
1-5	8 (72.7)	2 (66.7)	6 (75.0)
5-10	0	0	0
10-15	1 (9.1)	0	1 (12.5)
15-20	0	0	0
20 or more	2 (18.2)	1 (33.3)	1 (12.5)
Concurrent Use of Steroids or Immune Suppressing Medications (N, %) – missing 12	6 (6.9)	1 (3.6)	5 (8.5)
Concurrent use of NSAIDs – missing 13	38 (44.2)	10 (37.0)	28 (47.5)

Supplemental Table 2. Baseline Characteristics of Study Households in Primary Analysis Set

Characteristic	Total Households (N=33)
Number of persons in household (Median, Min-Max)	3.5 (2-5)
House size (in square feet) as reported by index (Median, Min-Max)	1400 (740-3300)
Missing or unknown data from 11 households	

Supplemental Table 3. SARS-CoV-2 Viral Kinetics in Primary Analysis Set, Excluding 2 Cases of Outside Introduction

Outcome	Index Cases (N=30)^a	Infected Contacts (N=26)
Lowest Ct (median, min-max)	25.65 (15.9-35)	23 (8.1-36.2)
Duration of viral shedding ^b (median, min-max)	6.5 days (1-19)	8 days (1-20)
Time to first positive SARS-CoV-2 from index diagnosis date	N/A	3 days (0-10)

a. Excluding 3 index cases who were PCR negative at baseline.

b. From first positive SARS-CoV-2 test.

Supplemental Table 4. Sequencing Performance

Household	Participant	Samples	Samples Producing Genome with Minimum Unambiguous Genome Length of 15 kbp
AXB	1	1	0
	2	6	5
JRP	1	5	5
	2	6	6
ODK	1	1	1
EGI	1	6	6
	4	5	4
CWA	1	4	3
	2	4	3
VBL	1	1	1
TSE	1	1	1
	2	6	5
KQX	1	1	1
DUC	1	2	1
	2	8	7
MPO	2	5	4
	3	9	7
	4	4	3
HXJ	1	4	1
	3	5	5
BQE	1	7	5
	2	5	5
SVW	1	1	1

IRG	1	2	2
	2	6	6
	3	4	3
	4	8	5
LCT	1	7	5
	4	11	9
	5	9	9
PFK	1	1	1
	4	2	1
JDU	1	1	1
XOA	1	6	1
	2	4	4
REZ	1	1	0
WMD	1	2	1
	3	4	3
HSA	1	1	1
	2	5	3
YVB	1	1	0
NKF	1	1	1
	2	1	0
QEC	1	1	1
OXS	1	2	2
	2	1	1
	4	2	2
LME	1	1	1

Supplemental Table 5. Household Transmission Analysis

Household	Transmission Direction	SNV Distance	Difference in Dates of Diagnosis (Days)	iSNV Information	Transmission Pair Categorization	Household Transmission Categorization
JRP	1>2	1	4		Highly probable	Highly probable
EGI	1>4	1	4		Highly probable	Highly probable
CWA	1>2	0	2	C21721T; T22917A; C23673T present at mixed sites in 1 (possible BA.2.12.1 & BA.2.10 co-infection) and fixed in 2	Possible	Possible
	2>1	0	-2		Possible	
TSE	1>2	3	5		Unlikely	Unlikely
	2>1	3	-5		Unlikely	
DUC	1>2	0	2		Possible	Possible
	2>1	0	-2		Possible	
MPO	4>2	0	3		Possible	Possible
	4>3	0	6		Possible	
	2>4	0	-3		Possible	
	2>3	0	3		Possible	
HXJ	1>3	0	1	share C23393T at < 10% frequency	Possible	Possible
	3>1	0	-1		Possible	
BQE	2>1	0	2		Possible	Possible
	1>2	0	-2		Possible	
IRG	1>4	3	2		Unlikely	Mixed household
	4>1	3	-2		Unlikely	
	4>2	0	3		Possible	
	4>3	0	5		Possible	
	2>3	0	2		Possible	
LCT	4>1	4	1		Unlikely	Mixed household

	1>4	4	-1		Unlikely	
	4>5	0	5		Possible	
PFK	1>4	0	6		Highly probable	Possible
XOA	1>2	13	9	share C3832T at < 10% frequency	Unlikely	Unlikely
WMD	1>3	20	12		Unlikely	Unlikely
HSA	1>2	2	5		Highly probable	Possible
OXS	1>2	0	2		Possible	Possible
	1>4	0	2		Possible	
	2>1	0	-2		Possible	
	2>4	0	0		Possible	
	4>1	0	-2		Possible	
	4>2	0	0		Possible	

FIGURE 1

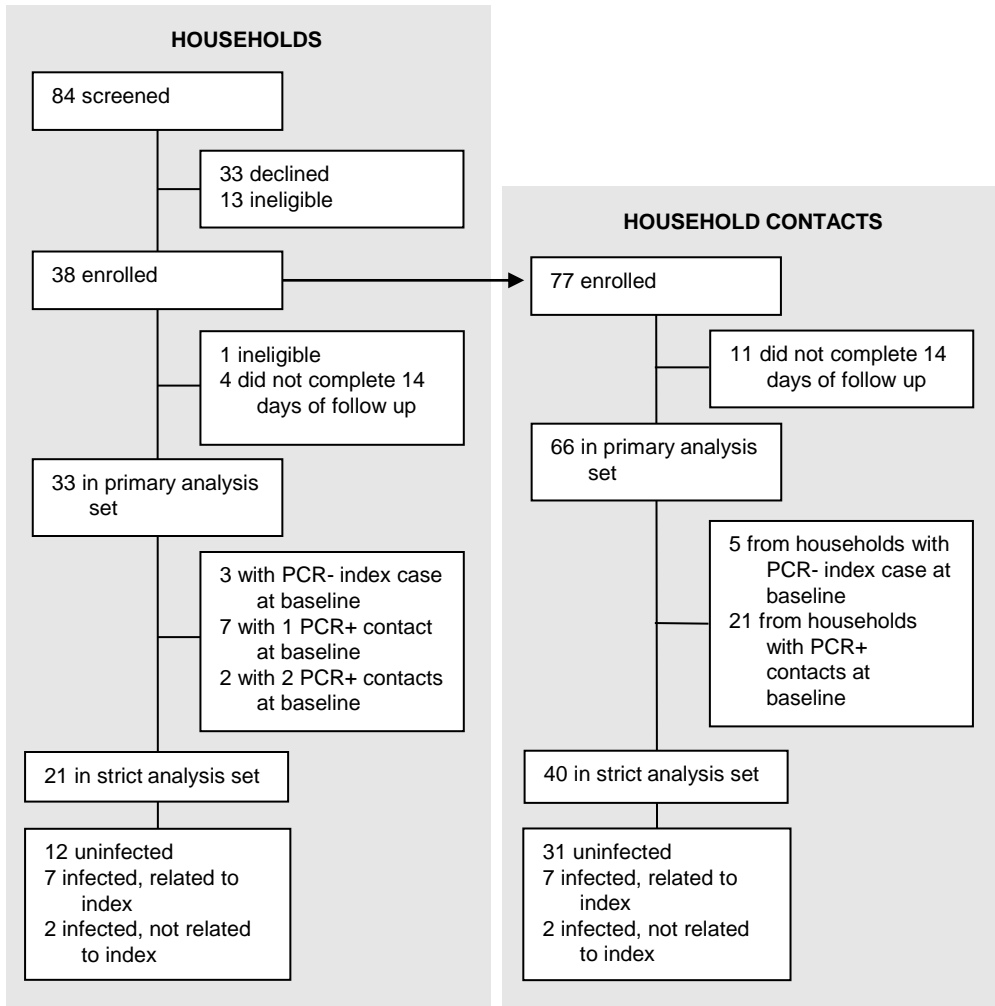
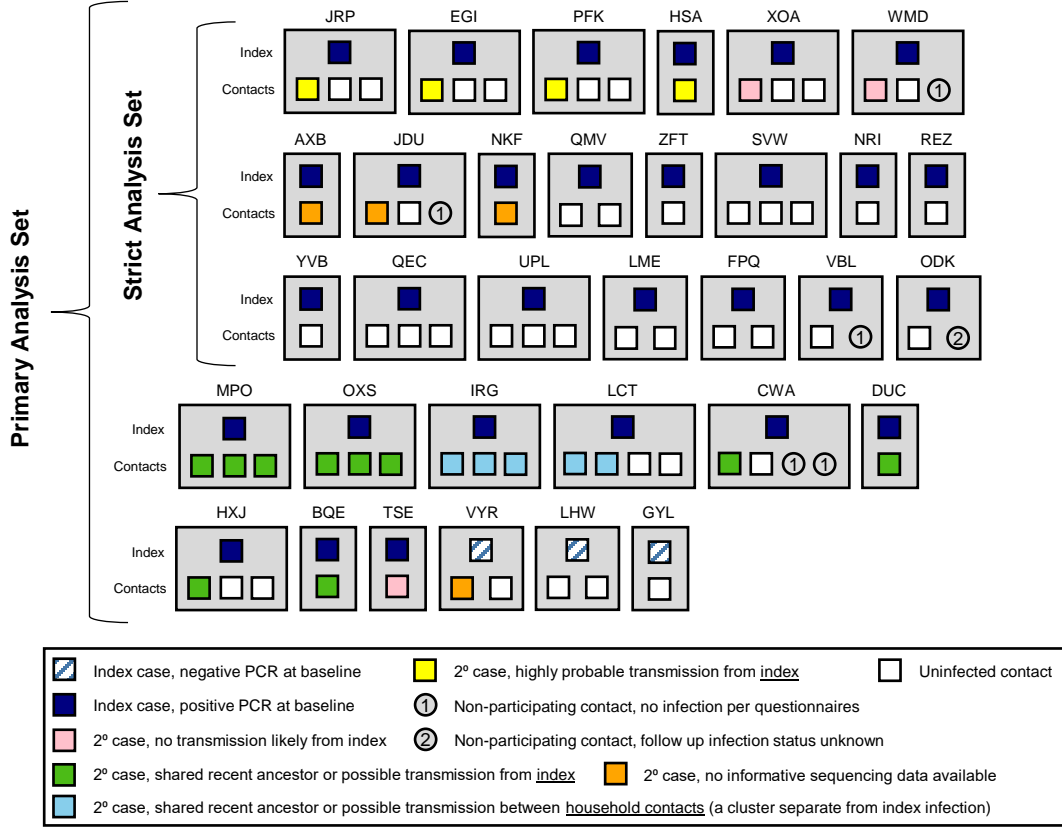


FIGURE 2

A



B

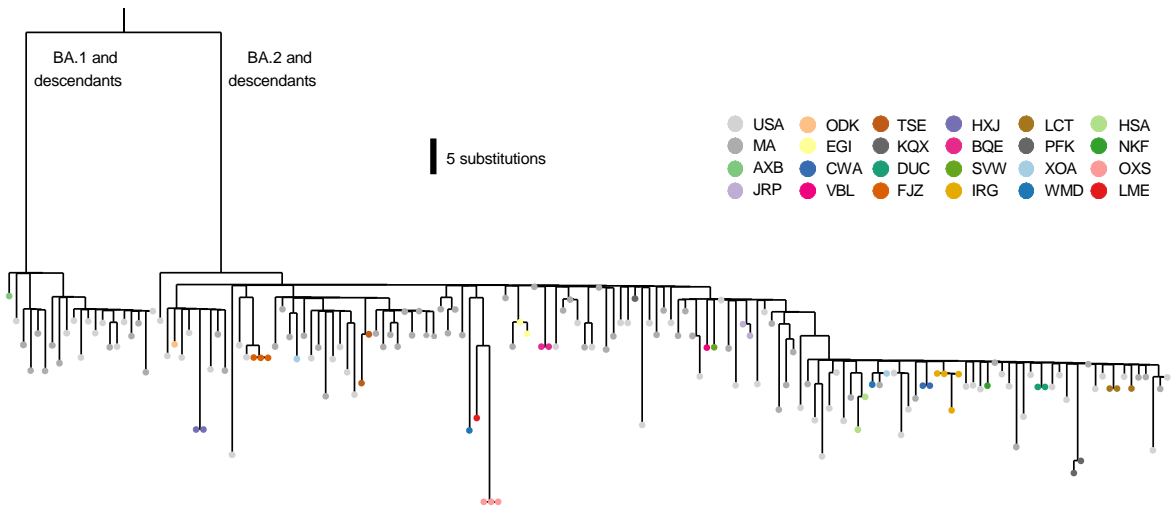
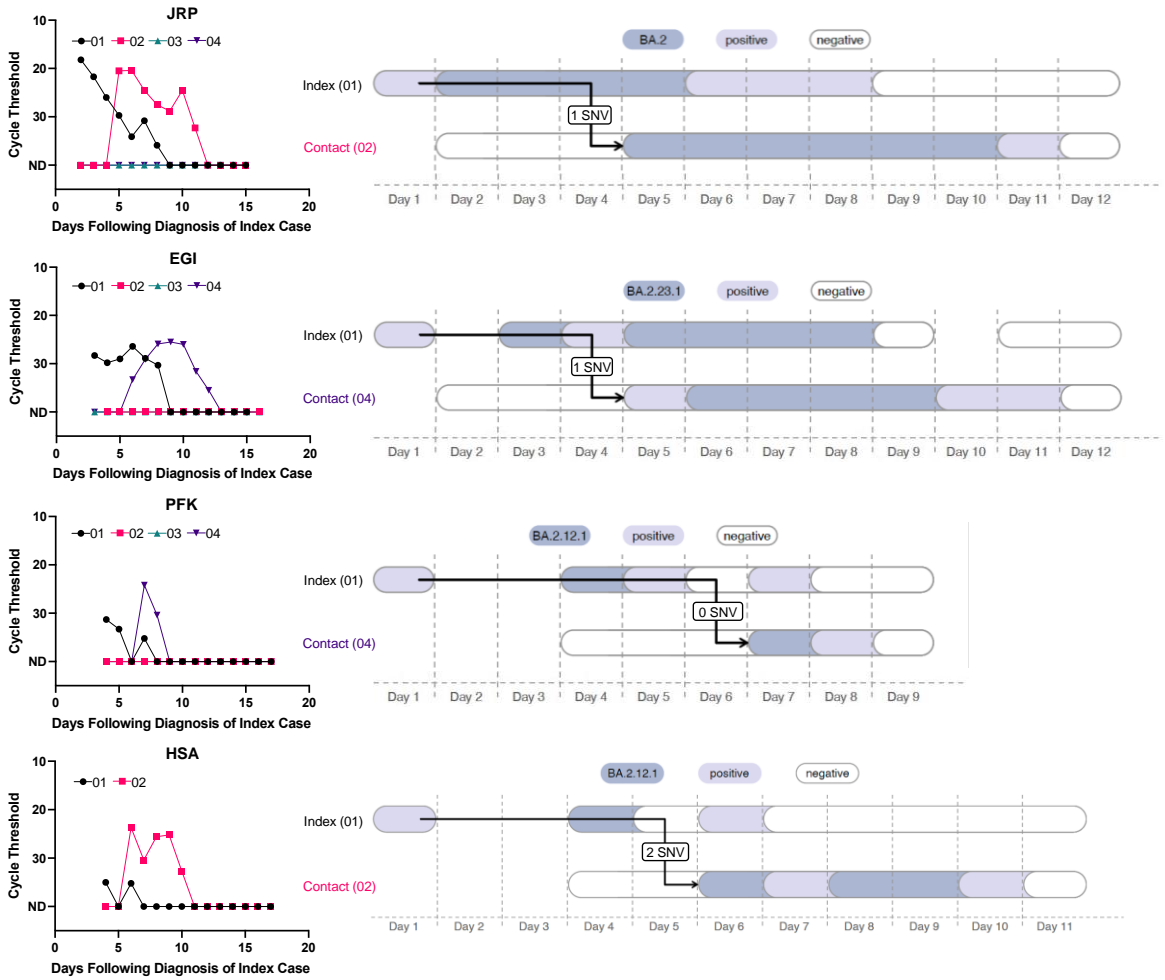
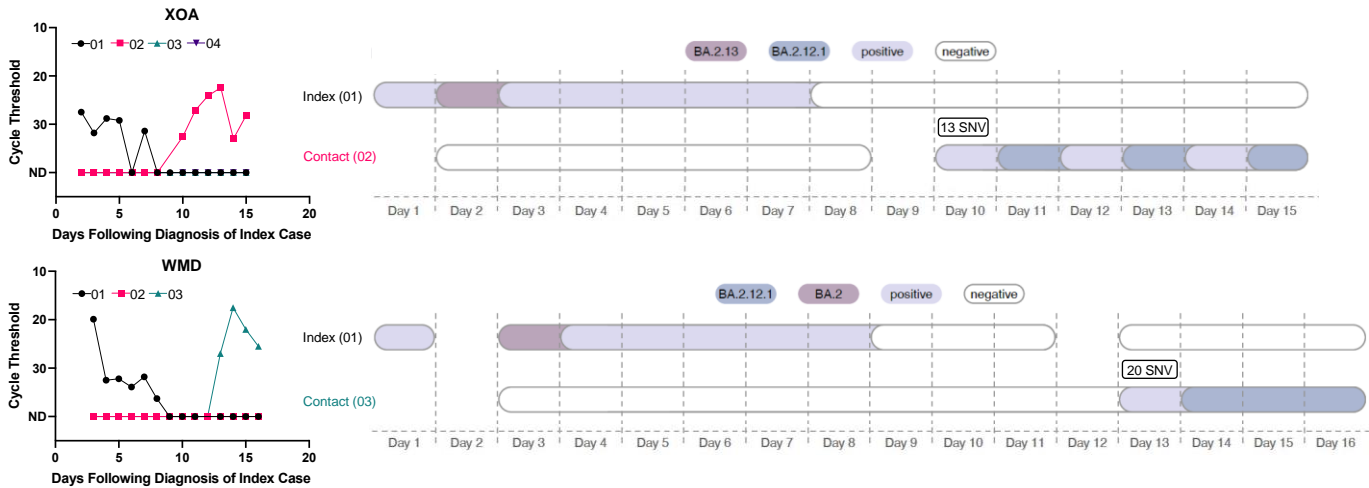


FIGURE 3

A



B



C

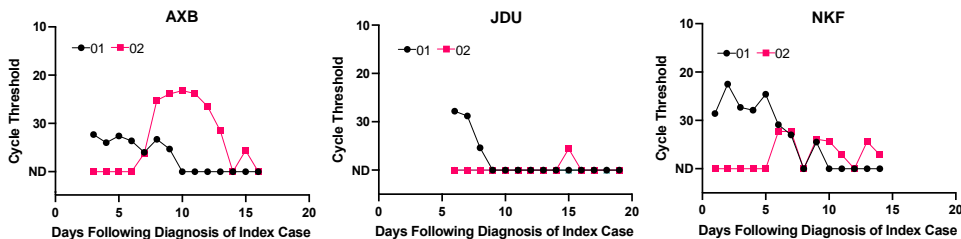
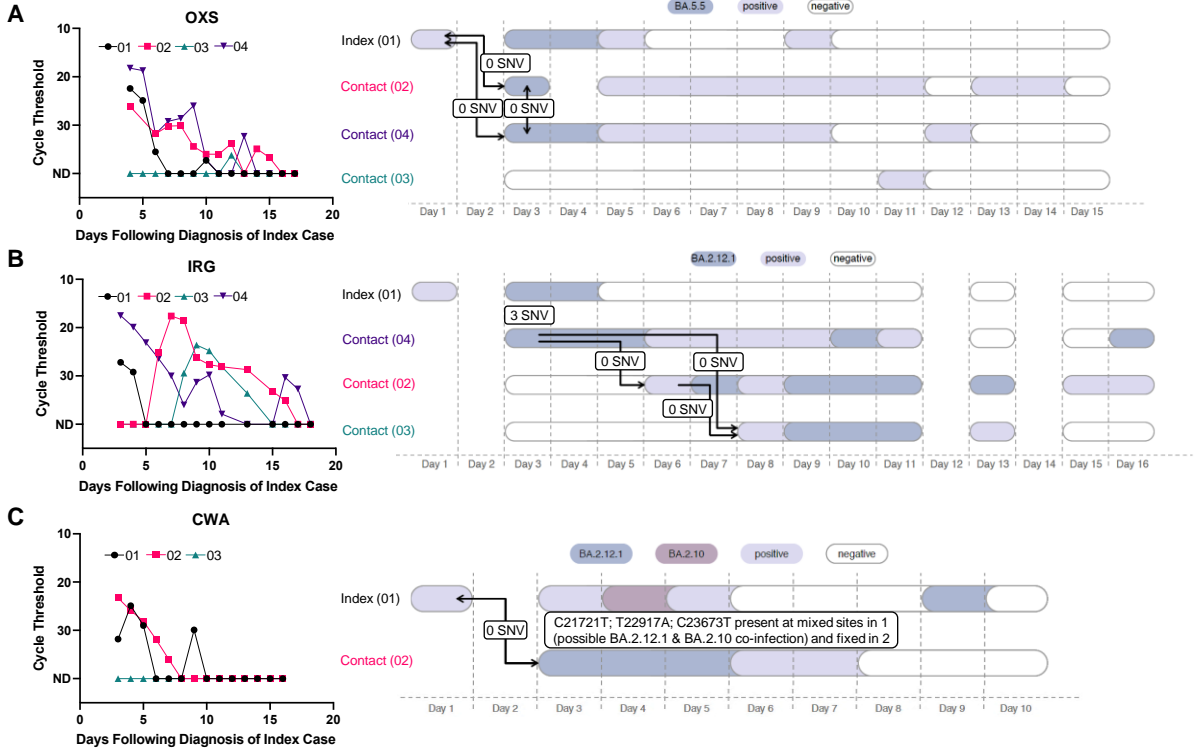


FIGURE 4



SUPPLEMENTAL FIGURE 1

