1 The genomic variation landscape of globally-circulating clades of

2 SARS-CoV-2 defines a genetic barcoding scheme

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24 ABSTRACT

25 We describe fifteen major mutation events from 2,058 high-quality SARS-CoV-2 26 genomes deposited up to March 31st, 2020. These events define five major clades (G. I. S. 27 D and V) of globally-circulating viral populations, representing 85.7% of all sequenced 28 cases, which we can identify using a 10 nucleotide genetic classifier or barcode. We applied 29 this barcode to 4,000 additional genomes deposited between March 31st and April 15th and 30 classified successfully 95.6% of the clades demonstrating the utility of this approach. An 31 analysis of amino acid variation in SARS-CoV-2 ORFs provided evidence of substitution 32 events in the viral proteins involved in both host-entry and genome replication. The 33 systematic monitoring of dynamic changes in the SARS-CoV-2 genomes of circulating 34 virus populations over time can guide therapeutic and prophylactic strategies to manage 35 and contain the virus and, also, with available efficacious antivirals and vaccines, aid in the 36 monitoring of circulating genetic diversity as we proceed towards elimination of the agent. 37 The barcode will add the necessary genetic resolution to facilitate tracking and monitoring 38 of infection clusters to distinguish imported and indigenous cases and thereby aid public 39 health measures seeking to interrupt transmission chains without the requirement for real-40 time complete genomes sequencing.

41

42 **INTRODUCTION**

SARS-CoV-2 has now reached 185 countries across all continents, except Antarctica.
With over 2.5 million cases currently confirmed globally¹, a pandemic was declared by the
World Health Organisation (WHO) on March 11th, 2020. SARS-CoV-2 belongs to the

46 Coronaviridae family, genus Betacoronavirus, which are enveloped positive-sense, single-47 stranded RNA viruses, of zoonotic origin. Among human RNA viruses, coronaviruses have 48 the largest known genome (~30 kb), which consists of the structural proteins (spike, 49 envelope, membrane and nucleocapsid), nonstructural proteins (nsp1-16), and accessory 50 proteins (ORF3a, ORF6, ORF7a and b, ORF8, ORF10). Structural proteins are required 51 for host cell entry, viral assembly and exit^{2,3}. Nonstructural proteins are involved in genome 52 replication-transcription and formation of vesicles⁴, whereas accessory proteins interfere 53 with host innate defense mechanisms^{5,6,7}. During replication within the host, the virus 54 acquires genome mutations, which can be passed on to virus progeny in subsequently 55 infected individuals. Systematically tracking mutations in SARS-CoV-2 genomes is 56 therefore important as it allows monitoring of the molecular epidemiology of circulating 57 viral sequences nationally and internationally. Here, we have investigated the genomic 58 variation landscape of a large set of globally-derived SARS-CoV-2 genomes and defined 59 major mutation events. This analysis allowed us to produce a first-generation genetic 60 classifier, or 'barcode', defining the major clades of the virus circulating up to April 15th, 61 2020. Notably, this barcode allowed reliable tracking of the spatial distribution and 62 prevalence of these viral clades over time. While most of the nonsynonymous mutation 63 events appear neutral with respect to protein function and stability, we also found evidence 64 of mutations in the spike protein that may modulate the interaction between SARS-CoV-2 65 and the host.

66 **RESULTS**

Five clades of SARS-CoV-2 are characterised by 15 major mutational events across
the globe.

69 The SARS-CoV-2 genome is genetically most closely related (96%) to a bat SARS-70 related coronavirus (SARSr-CoV) RaTG13 and also to SARSr-CoVs from pangolins⁸ 71 (Supplementary Figure 1). We analysed single nucleotide polymorphisms (SNPs) of 2,058 72 high-quality complete genomes downloaded from GISAID⁹ (March 31st). We studied their 73 chronological occurrences during the spread of the SARS-CoV-2 across human 74 populations, which allowed us to define several major and minor clades of the virus that 75 share unique SNPs (Supplementary Table 1, Supplementary Figures 2, 3). We observed 76 1,221 SNPs in the current dataset with 753 missense, 452 silent, 12 nonsense and 4 77 intergenic substitutions. We defined five major clades (Figure 1) compared to the prototype 78 (MN908947.3), covering 85.7% of the global set of SARS-CoV-2 high-quality genomes 79 publicly available up to March 31st. The clades were named by the amino acid mutation: S 80 (Orf8, L84S), V (Orf3a, G251V), I (Orf1ab, V378I), D (Orf1ab, G392D) and G (S, 81 D614G).

82 These 5 clades are characterised by 15 major nucleotide substitution events in the 83 SARS-CoV-2 genome (Figure 1, Figure 2 and Supplementary Figure 3) representing 1,763 84 genomes (85.7%) from 45 countries. To obtain a global picture of the regional distribution 85 of the clades over time during a 14 week period, we plotted the relative proportions of the major and minor clades and their cumulative trend (Figure 3). We observed major 86 87 differences in the apparent spread for individual clades: Clade G represents 46.2% of all 88 the sequenced viral sequences, followed by S (25.4%), V (9.4%), I (2.6%) and D (2.1%). 89 The remaining 14.3% were not assigned to a major clade. Clade G is widely distributed in 90 Africa, Europe, West Asia and South America; whereas Clade S represents 63% of North

91 American sampled genomes, and nearly a quarter of those from Oceania. Clade I represents 92 around one-third of genomes derived from South and West Asia, and Oceania. Southeast 93 Asia and South Asia have the greatest number of unassigned genomes (56.9%). For these 94 genomes that cannot be assigned to a major clade, we identified nine minor clades which 95 were named for the amino acid mutation or nucleotide substitution (the latter shown in 96 bold): H (Orflab, Q676H); H2 (M, D209H); L2 (N, S194L, we name it L2 to avoid 97 confusion with the previously defined clade⁸); S2 (N, P344S); G11410A (Orflab, 98 G11410A); Y (S, H49Y); C17373A (Orflab, C17373A); I2 (Orflab, T6136I) and K 99 (*Orf1ab*, T2016K). The minor clades represent any monoclades with $n \ge 5$ which covers 100 3.2% of the total 2,058 cases. The global and regional cumulative trends were plotted over 101 time, with the majority of the trends revealing the increasing dominance of one or two 102 clades in each geographic region. For example, the Asian and Oceanian genomes are 103 largely clade I whereas European genomes are predominantly clade G with clade S 104 predominating in North America cases. This is likely attributable to founder effects during 105 the early phases of the seeding of the local epidemics from imported cases and subsequent 106 dissemination in the regions.

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The genetic barcoding method assigns new SARS-CoV-2 cases to clades with high
 sensitivity.

We defined a 10 nucleotide genetic barcode of SARS-CoV-2 that identified with high
sensitivity the five major clades of the circulating viral genomes available on March 31st,

112 based on the GISAID data (Figure 4A, Table 1). Given that SARS-CoV-2 evolves at an average rate/genome of nearly 8 x 10⁻⁴ nucleotide substitutions/site/year¹⁰, and is subject 113 114 to back-mutations, we further tested the sensitivity and specificity of these clade-defining 115 SNPs, which are all above 90% (Table 1). We then applied the 10 nucleotide barcode to 116 the 4,000 SARS-CoV-2 genomes that became available in GISAID between March 31st 117 and April 15th, 2020 in the early stages of the pandemic. Among the 4,000 globally-118 circulating genomes from 66 countries, we could assign \sim 96% to one of the 5 major clades 119 (Figure 4B). The remaining unassigned 4% of genomes were typified by either errors in 120 their sequences (such as 'N's in the genome assemblies), or single cases those could not be 121 reliably assigned to any of the major clades. The increase in the correct clade assignment 122 for the new genomes compared to the initial validation of the methodology on 2,058 123 genomes (from which the barcode was established) was indicative of the rising dominance 124 of a few major clades, and suggested that the 10 nucleotide barcode will retain its predictive 125 power as new genomes are obtained. While this barcode represents a snapshot of the early 126 phases of the genetic diversity of the virus during the first 16 weeks of its global spread 127 and is expected to change over time, a barcoding strategy to monitor the progress of virus 128 elimination after vaccines become widely available will be strategically useful to monitor 129 decreases in viral genetic diversity. In addition, our barcode could serve as a reference for 130 setting the baseline for global genomic diversity analysis at the beginning of the pandemic.

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132 Mutations are not equally distributed across the SARS-CoV-2 genome.

Based on our analysis of the 2,058 available genomes from GISAID (March 31^{th} , 2020) we observed that the genes *S*, *N* and *Orf3a*, accumulated markedly more mutations than

135 expected solely by random drift (Supplementary Figure 4) (Real/Expected ratio: S: 1.21; 136 N: 1.99; ORF3a: 1.82). This mutation rate may indicate adaptation to the human host 137 following recent spill over from an, as yet unknown, animal reservoir. Conversely, several 138 nonstructural proteins showed a lower-than-expected mutation rate (Real/Expected ratio: 139 nsp1: 0.22; nsp3: 0.77; nsp5: 0.70; nsp7: 0.77: nsp12: 0.88; nsp14: 0.68; nsp15: 0.76). 140 These proteins are predicted to be involved in evading host immune defenses, in enhancing viral expression and in cleavage of the replicase polyprotein, based on prior studies of 141 related betacoronaviruses^{11,12}. Hence, this lower mutation rate may indicate purification 142 143 selection to maintain these functions essential for efficient immune evasion and subsequent 144 viral dissemination. Indeed, structural proteins in coronaviruses undergo a greater degree 145 of antigenic variation which increases the fitness of the virus by means of adaptation to the 146 host and by facilitating immune escape¹³.

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148 Structural protein modeling confirmed that most of the nonsynonymous mutations in 149 the nonstructural proteins were neutral (Supplementary Figure 5-13). Conversely, several 150 nonsynonymous mutations in the spike protein might have functional consequences: 151 notably, the G clade-defining mutation D614G is located in subdomain 1 (SD1; Figure 5, 152 Supplementary Figure 5). In the trimeric S, D612 engages stabilising interactions within 153 SD1 (R646 or the backbone of F592, depending on the chain) and with the S1 of the 154 adjacent chain (T859 and K854). Replacement of D614 with a glycine would entail losing 155 these stabilising electrostatic interactions and increase the dynamics in this region. Notably, 156 V483A (found in 13 cases in Washington state, USA), V367F (in 6 cases: 5 in Paris, France; 157 1 in Hong Kong) and G476S (in 7 cases: 4 in Washington state, USA; 1 in Idaho state,

158 USA; 1 in Oregon state, USA; and 1 in Braine-l'Alleud, Belgium) are localised in the 159 receptor binding domain (RBD) of the spike protein which mediates binding to the host 160 receptor angiotensin-converting enzyme 2 (ACE2) (Figure 5)³. All of the viral genomes 161 harbouring V483A and G476S mutations belong to Clade S. Interestingly, the V367F 162 mutation has appeared independently in Clade V and Clade S, suggesting that this mutation 163 contributes to viral fitness. We found the V483A substitution in 13 closely-related cases 164 from Washington State. An equivalent amino acid substitution located in a similar position 165 within the RBD in the MERS-CoV spike protein reduces its binding to its cognate receptor 166 DPP4/CD26¹⁴ (Supplementary Table 2). However, V483 is more than 10Å away from 167 ACE2 and could affect receptor binding by SARS-CoV-2 only indirectly by altering the 168 structural dynamics of the RBD loop it is a part of. The V367F mutation is located in an 169 even greater distance from ACE2 (Figure 5, Supplementary Figure 5D). The exchange of 170 the small hydrophobic residue valine with a bulky hydrophobic phenylalanine might 171 influence the efficiency of glycosylation of the nearby N343, or the positioning of the 172 sugars. The substitution G476S would lead to possible clashes with predicted interacting 173 ACE2 residues and with the RBD residue N487. However, minor reorientation of the side 174 chains might allow an additional hydrogen bond to be formed between S476 and ACE2 175 Q24 and E23, thus enhancing the affinity (Supplementary Figure 5D) to ACE2. An 176 equivalent amino acid substitution located in an analogous position within the RBD in the 177 SARS-CoV spike protein was associated with neutralisation escape from monoclonal antibodies, together with other mutations observed previously¹⁵ (Supplementary Table 2). 178 179 Given that V483A and V367F are solvent exposed and markedly alter the surface 180 characteristics of the RBD, they might also facilitate antibody evasion. Escape mutations

181 in the RBD of the SARS-CoV S protein (T332I, F460C and L443R) were identified previously¹⁵. These mutations negatively impact viral fitness through reducing the affinity 182 to the host receptor¹⁶ (Supplementary Table 2). The nonsynonymous mutations in the N 183 184 protein, which have key roles in viral assembly, might also have functional implications. 185 The hotspot mutations S202N, R203K and G204R all cluster in a linker region where they 186 might potentially enhance RNA binding and alter the response to serine phosphorylation 187 events (Supplementary Figure 6). The clade I-defining mutation in the nucleocapsid 188 protein, which has key roles in viral assembly, is synonymous. However, we observed 189 nonsynonymous mutations in the nucleocapsid protein that are predicted to have functional 190 implications. The hotspot mutations S202N, R203K and G204R all cluster in a linker 191 region where they might potentially enhance RNA binding and alter the response to serine 192 phosphorylation events (Supplementary Figure 6).

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194 **DISCUSSION**

195 In this study, we have defined 5 major clades (G, I, S, D and V) and 9 minor clades 196 (H2, L2, G1110A, H, Y, C17373A, S2, I2 and K) which covers ~89% of the 2,058 high 197 quality genomes available until March 31st in GISAID database. The clustering of these 198 genomes revealed the spread of clades to diverse geographical regions (Figure 1, Figure 3). 199 This pattern contrasts with those observed for other epidemic coronaviruses, such as MERS-CoV, which display distinct geographical clustering¹⁷. For example, clade G, which 200 was first detected on January 28th, has reached 40 countries and 130 cities, within a span 201 202 of 10 weeks (Supplementary Table 1). This pattern demonstrates efficient viral 203 transmission through frequent intercontinental travel during the period when international

travel restrictions were only present sporadically, which has enabled the virus to spread to multiple distant locations within a short period of time. This observation reinforces the importance of curtailing international travel and imposing restrictions early in pandemics and imposing social distancing in order to contain the global spread of viruses.

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209 We have observed a distinct distribution of the major clades in different parts of the world (Figure 3). Most of the viral genomes that have not been assigned to a major clade 210 211 are found in Asia and have earlier detection times in January and February at the start of 212 the epidemic in China (Supplementary Figure 2). We observed a decrease in the genetic 213 diversity of the virus over time following dissemination from China, especially in Europe 214 and North America that each notably now has a predominant clade type, which we believe 215 to be associated with a founder effect whereby a single clade was introduced and 216 subsequently disseminated (Figure 3). An important caveat of the present study is that the 217 current sampling of available public genomes does likely not represent the extant genetic 218 diversity of virus populations in circulation due to biases of genome data deposits from the 219 sequencing laboratories based mainly in the northern hemisphere and new datasets may 220 define new clades in the near future from regions, including Africa, the Indian subcontinent 221 and Latin America with comparably few genomes available at present. In this case, 222 additional identifiers within an evolving barcode scheme can be added to track and monitor 223 future emerging clades with higher resolution. On the other hand, the genetic stability of 224 SARS-CoV-2¹⁸ may result in the continuing circulation of a limited number of clades until 225 such time as mitigation measures including the isolation of vulnerable populations and the 226 availability of efficacious antivirals and vaccines reduces the genetic diversity in

circulation. This molecular genotyping approach has been demonstrated for other viruses (e.g. measles, poliovirus, rotavirus and human papillomaviruses) with herd-immunity vaccination programmes working to eliminate pathogens from endemic circulation in humans^{19,20,21,22}. The availability of a barcoding scheme that rapidly generates a SNP allowing clade assignment will be critical in this elimination phase when widespread availability of vaccines permits eradication of SARS-CoV-2 from endemicity in humans.

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234 Our work provides a baseline global genomic epidemiology of SARS-CoV-2 prior to 235 introduction of therapeutic and prophylactic approaches. The mutational landscape of 236 global populations of over SARS-CoV-2 6,000 genomes provides an evidence-based 237 framework for tracking the clades that comprise the pandemic on different continents. 238 However, due to the bias in the representation of countries depositing the SARS-CoV-2 239 genomes with over-representation of North American and European genomes (28.3% and 240 47.2% respectively) and the available genome data representing only a minute proportion 241 of the total COVID-19 positive cases from each of these regions (America, 0.27%; Europe, 0.31%; China, 0.31%. Data collected from GISAID⁹ and COVID-19 dashboard¹), the 242 243 genetic barcode described hererin may need to be updated in order to be globally representative, once sufficient numbers of genomes covering less represented parts of the 244 245 world are eventually sequenced and deposited to publicly-available database. We envisage 246 a qPCR-based allelic discrimination approach, such as PCR allele competitive extension 247 (PACE), which would enable rapid turnaround in real-time following the identification of 248 a laboratory-confirmed case. This would allow viral genetic epidemiological data to be 249 added to contact tracing information to allow efficient detection of circulating SARS-CoV-

250 2 clades that will allow discrimination of autochthonous and imported clades to aid 251 progressive elimination of the genetic diversity and, ultimately, eradication in all regions. 252 A robust genetic barcoding scheme for SARS-CoV-2 can facilitate this molecular tracking 253 of larger numbers of laboratory-confirmed cases and by implementing such a facile 254 genotyping approach upstream of next-generation sequencing will allow whole genome 255 sequencing to be performed on selected cases. This is of particular relevance when the 256 available genomes represent only a small sample of the over 2.5 million total COVID-19 257 cases globally to date.

258

259 METHODS

260 Phylogenomic Analysis

1,427 coronavirus genomes were downloaded from Virus Pathogen Database and Analysis Resource (ViPR)²³ on February 14th 2020, including 329 SARS, 35 SARS-CoV-2, 61 NL63, 521 MERS, 52 HKU1, 170 OC43, 97 bovine coronaviruses and 61 mouse hepatitis viruses. Sequence alignment was performed using MAFFT(version 7.407)²⁴ software and then trimmed by trimAL(version 1.4.1)²⁵. Phylogenetic analyses of the complete genomes were done with FastTree(version 2.1.10)²⁶ software with default parameters, and iTOL(version 5)²⁷ was used for phylogenetic tree visualisation.

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269 2,127 complete SARS-CoV2 genomes were downloaded from the GISAID9 (March 31th
2020). 69 of those genomes were removed due to poor assembly quality resulting in 2,058
271 complete genomes that were subsequently used for analysis. Sequence alignment was
272 performed with MAFFT(version 7.407)²⁴ and trimmed by trimAL(version 1.4.1)²⁵.

Phylogenetic analyses of the complete genomes were performed with RAxML²⁸ (version 273 274 8.2.12) with 1,000 bootstrap replicates, employing the general time-reversible nucleotide substitution model. iTOL(version 5)²⁷ was used for the phylogenetic tree visualisation. 275 276 SNPs from each of the genomes were called by Parsnp (version 1.2) from the Harvest 277 suite²⁹ using MN908947.3 as the reference genome, and the SNPs were further annotated by SnpEff(version 4.3m)³⁰. The monoclades associated with SNPs with a frequency ≥ 40 278 279 were defined as major clades and monoclades associated with SNPs with a frequency ≥ 5 280 were defined as minor clades.

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282 Protein Structural Analysis

Experimentally determined protein structures were obtained from the Protein Data Bank (PDB). SwissModel³¹, I-Tasser³², RaptorX³³ and an in-house modelling pipeline was used to produce protein structure homology models. Phobius³⁴ was used for prediction of transmembrane regions. RaptorX was also used for predicting secondary structure, protein disorder and solvent exposure of amino acids. Pymol(version 1.8.6.2) was used for visualization.

289

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301 AUTHOR CONTRIBUTIONS

302 AP conceived the study and supervised the work; AP and QG designed the analysis. QG,

303 MS and SA performed the data analysis and prepared the initial draft of the manuscript,

- 304 followed by edits from AP, MC and RN. All authors have commented on various sections
- 305 of the manuscript.
- 306

307 COMPETING INTERESTS

308 The authors have no conflicts of interest to declare.

309 REFERENCES:

- 310 1. Dong, E., Du, H. & Gardner, L. An interactive web-based dashboard to track
- 311 COVID-19 in real time. *Lancet. Infect. Dis.* **3099**, 19–20 (2020).
- 312 2. Bárcena, M. et al. Cryo-electron tomography of mouse hepatitis virus: Insights
- 313 into the structure of the coronavirion. *Proc. Natl. Acad. Sci. U. S. A.* (2009).
- doi:10.1073/pnas.0805270106

315	3.	Hoffmann, M. et al. SARS-CoV-2 Cell Entry Depends on ACE2 and TMPRSS2
316		and Is Blocked by a Clinically Proven Protease Inhibitor Article SARS-CoV-2
317		Cell Entry Depends on ACE2 and TMPRSS2 and Is Blocked by a Clinically
318		Proven Protease Inhibitor. Cell 181, 1–10 (2020).
319	4.	Hagemeijer, M. C. et al. Membrane rearrangements mediated by coronavirus
320		nonstructural proteins 3 and 4. Virology (2014). doi:10.1016/j.virol.2014.04.027
321	5.	Wu, A. et al. Genome Composition and Divergence of the Novel Coronavirus
322		(2019-nCoV) Originating in China. Cell Host Microbe (2020).
323		doi:10.1016/j.chom.2020.02.001
324	6.	Wu, F. et al. A new coronavirus associated with human respiratory disease in
325		China. Nature (2020). doi:10.1038/s41586-020-2008-3
326	7.	Liu, D. X., Fung, T. S., Chong, K. K. L., Shukla, A. & Hilgenfeld, R. Accessory
327		proteins of SARS-CoV and other coronaviruses. Antiviral Research (2014).
328		doi:10.1016/j.antiviral.2014.06.013

329	8.	Tang, X. et al. On the origin and continuing evolution of SARS-CoV-2. Natl. Sci.
330		<i>Rev.</i> 6 , (2020).
331	9.	Shu, Y. & McCauley, J. GISAID: Global initiative on sharing all influenza data –
332		from vision to reality. Eurosurveillance (2017). doi:10.2807/1560-
333		7917.ES.2017.22.13.30494
334	10.	Hadfield, J. et al. NextStrain: Real-time tracking of pathogen evolution.
335		Bioinformatics (2018). doi:10.1093/bioinformatics/bty407
336	11.	Báez-Santos, Y. M., St. John, S. E. & Mesecar, A. D. The SARS-coronavirus
337		papain-like protease: Structure, function and inhibition by designed antiviral
338		compounds. Antiviral Research (2015). doi:10.1016/j.antiviral.2014.12.015
339	12.	Posthuma, C. C., te Velthuis, A. J. W. & Snijder, E. J. Nidovirus RNA
340		polymerases: Complex enzymes handling exceptional RNA genomes. Virus
341		Research (2017). doi:10.1016/j.virusres.2017.01.023
342	13.	Walls, A. C. et al. Structure, Function, and Antigenicity of the SARS-CoV-2 Spike
343		Glycoprotein. Cell (2020). doi:10.1016/j.cell.2020.02.058

344	14.	Kleine-Weber, H. <i>et al.</i> Mutations in the Spike Protein of Middle East Respiratory
345		Syndrome Coronavirus Transmitted in Korea Increase Resistance to Antibody-
346		Mediated Neutralization. J. Virol. (2018). doi:10.1128/jvi.01381-18
347	15.	Rockx, B. et al. Escape from Human Monoclonal Antibody Neutralization Affects
348		In Vitro and In Vivo Fitness of Severe Acute Respiratory Syndrome Coronavirus.
349		J. Infect. Dis. (2010). doi:10.1086/651022
350	16.	Tang, X. C. et al. Identification of human neutralizing antibodies against MERS-
351		CoV and their role in virus adaptive evolution. Proc. Natl. Acad. Sci. U. S. A.
352		(2014). doi:10.1073/pnas.1402074111
353	17.	Kim, J. Il et al. The recent ancestry of Middle East respiratory syndrome
354		coronavirus in Korea has been shaped by recombination. Sci. Rep. (2016).
355		doi:10.1038/srep18825
356	18.	Jia, Y. et al. Analysis of the mutation dynamics of SARS-CoV-2 reveals the spread
357		history and emergence of RBD mutant with lower ACE2 binding affinity. <i>bioRxiv</i>
358		(2020).

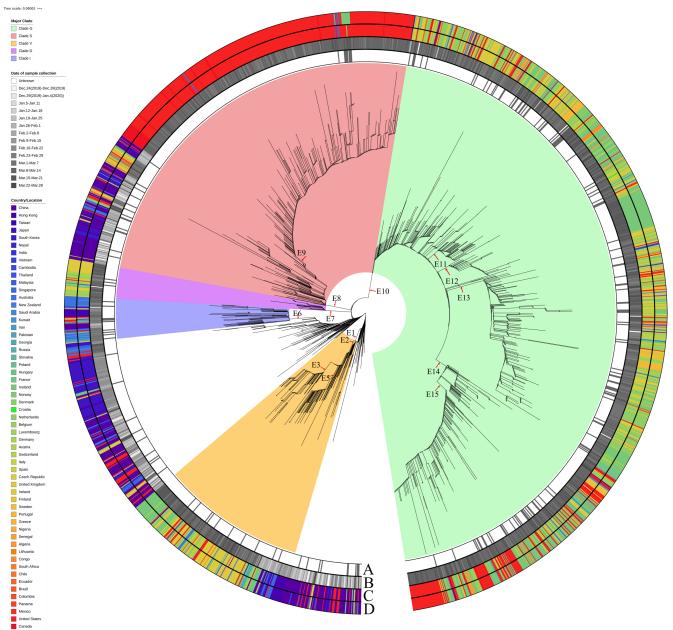
359	19.	Brown, K. E. et al. Genetic characterization of measles and rubella viruses
360		detected through global measles and rubella elimination surveillance, 2016-2018.
361		Morb. Mortal. Wkly. Rep. (2019). doi:10.15585/mmwr.mm6826a3
362	20.	Mankertz, A. et al. Spread of measles virus D4-Hamburg, Europe, 2008-2011.
363		Emerg. Infect. Dis. (2011). doi:10.3201/eid1708.101994
364	21.	Grassly, N. C. The final stages of the global eradication of poliomyelitis.
365		Philosophical Transactions of the Royal Society B: Biological Sciences (2013).
366		doi:10.1098/rstb.2012.0140
367	22.	Soares-Weiser, K. et al. Vaccines for preventing rotavirus diarrhoea: vaccines in
368		use. in Cochrane Database of Systematic Reviews (2012).
369		doi:10.1002/14651858.cd008521.pub3
370	23.	Pickett, B. E. et al. ViPR: An open bioinformatics database and analysis resource

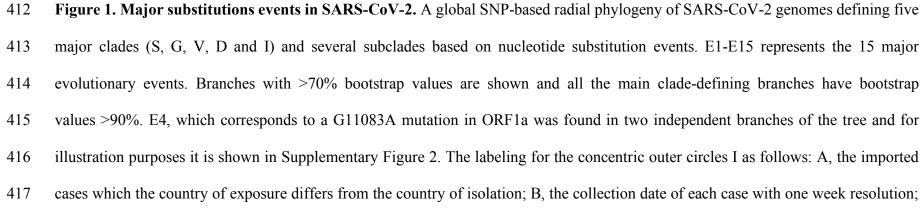
371 for virology research. *Nucleic Acids Res.* (2012). doi:10.1093/nar/gkr859

372	24.	Katoh, K. & Standley, D. M. MAFFT multiple sequence alignment software
373		version 7: Improvements in performance and usability. Mol. Biol. Evol. (2013).
374		doi:10.1093/molbev/mst010
375	25.	Capella-Gutiérrez, S., Silla-Martínez, J. M. & Gabaldón, T. trimAl: A tool for
376		automated alignment trimming in large-scale phylogenetic analyses.
377		Bioinformatics 25, 1972–1973 (2009).
378	26.	Price, M. N., Dehal, P. S. & Arkin, A. P. Fasttree: Computing large minimum
379		evolution trees with profiles instead of a distance matrix. Mol. Biol. Evol. (2009).
380		doi:10.1093/molbev/msp077
381	27.	Letunic, I. & Bork, P. Interactive Tree Of Life (iTOL): An online tool for
382		phylogenetic tree display and annotation. Bioinformatics (2007).
383		doi:10.1093/bioinformatics/bt1529
384	28.	Stamatakis, A. RAxML version 8: A tool for phylogenetic analysis and post-
385		analysis of large phylogenies. Bioinformatics 30, 1312–1313 (2014).

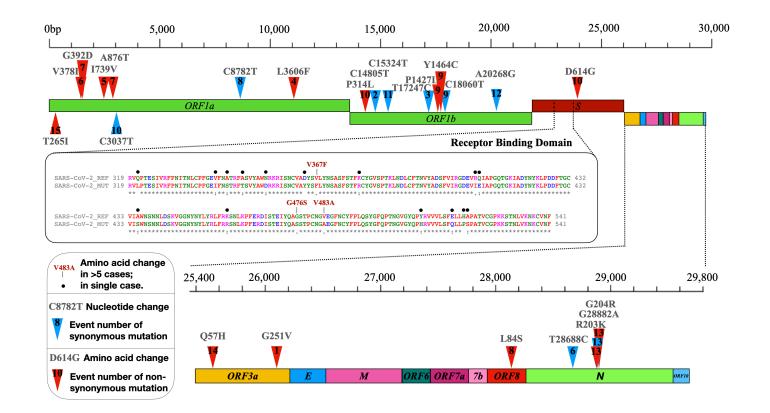
386	29.	Treangen, T. J., Ondov, B. D., Koren, S. & Phillippy, A. M. The harvest suite for
387		rapid core-genome alignment and visualization of thousands of intraspecific
388		microbial genomes. Genome Biol. 15, (2014).
389	30.	Cingolani, P. et al. A program for annotating and predicting the effects of single
390		nucleotide polymorphisms, SnpEff: SNPs in the genome of Drosophila
391		melanogaster strain w1118; iso-2; iso-3. Fly (Austin). (2012).
392		doi:10.4161/fly.19695
393	31.	Arnold, K., Bordoli, L., Kopp, J. & Schwede, T. The SWISS-MODEL workspace:
394		A web-based environment for protein structure homology modelling.
395		Bioinformatics (2006). doi:10.1093/bioinformatics/bti770
396	32.	Yang, J. et al. The I-TASSER suite: Protein structure and function prediction.
397		Nature Methods (2014). doi:10.1038/nmeth.3213
398	33.	Källberg, M., Margaryan, G., Wang, S., Ma, J. & Xu, J. Raptorx server: A
399		resource for template-based protein structure modeling. Methods Mol. Biol.
400		(2014). doi:10.1007/978-1-4939-0366-5_2

401	34.	Käll, L., Krogh, A. & Sonnhammer, E. L. L. Advantages of combined
402		transmembrane topology and signal peptide prediction-the Phobius web server.
403		Nucleic Acids Res. 35, (2007).
404	35.	Senior, A. W. et al. Improved protein structure prediction using potentials from
405		deep learning. Nature (2020). doi:10.1038/s41586-019-1923-7
406	36.	John Jumper, Tunyasuvunakool, K., Kohli, P. & Hassabis, D. Computational
407		predictions of protein structures associated with COVID-19. (2020). Available at:
408		https://deepmind.com/research/open-source/computational-predictions-of-protein-
409		structures-associated-with-COVID-19.
410		



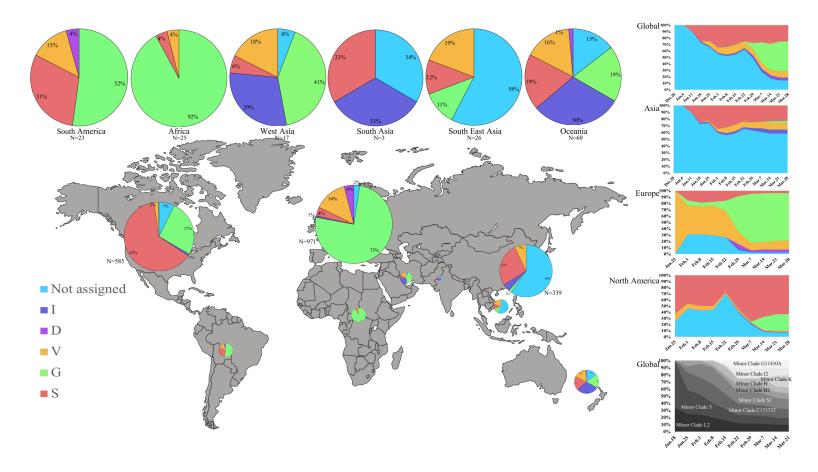


418 C, collection locations of the cases; D exposure locations of the cases.



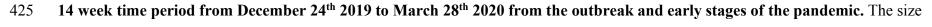
⁴¹⁹

- 420 Figure 2. Major mutations and associated variation in globally circulating SARS-CoV-2 genomes (n=2,058). Genomic localisation
- 421 of major mutation events as defined within our study. SARS-CoV-2 mutations in the receptor-bing domain (RBD) sequence contain all
- 422 amino acid substitutions from 2,058 genomes available up until March 31st 2020.





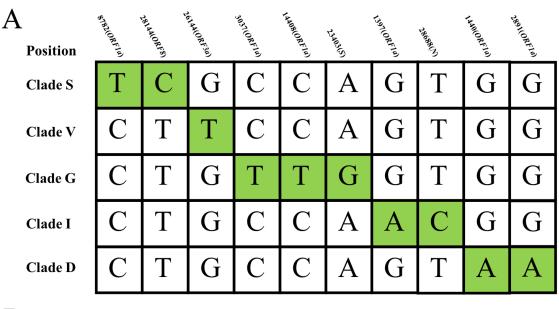
424 Figure 3. Global distribution of various major and minor clades of SARS-CoV2 genomes and their relative prevalence over a



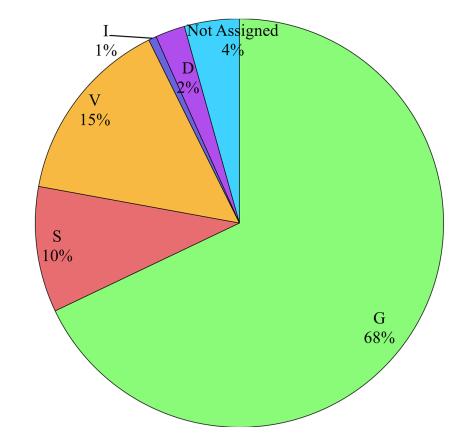
426 of each pie chart is proportional to the numbers within each respective clade (Europe, max=971; South Asia, min=3). The cumulative

- 427 trend of the clades is shown on the right and the span of time indicates the first and last observed case in each particular clade, until
- 428 March 28th 2020.

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В



430

431 Figure 4. Major mutations and associated variation in globally circulating SARS-

432 CoV-2 genomes (n=6,058) available until April 15th 2020. (A) A 10 nucleotide SNP

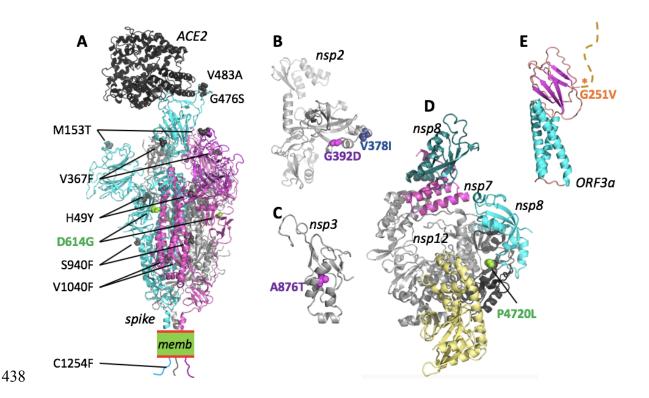
433 genetic barcode that defines the 5 clades of SARS-CoV-2. (B) By applying this barcode

434 we are able to classify 95.6% of the cases published between March 31st and April 15th

435 2020 during the early phase of the pandemic. Pie charts showing the percentage of each

436 major clade by applying a 10 nucleotide genetic classifier to 4,000 new genomes

437 downloaded from GISAID.



439 Figure 5: Mapping of SARS-CoV-2 clade-defining mutations onto the proteins. 440 Nonsynonymous mutations for proteins where the 3D structure was experimentally 441 determined (spike, nsp12/7/8) or can be inferred with reasonable confidence. Mutations are 442 colour-coloured as for the corresponding clades in Figure 3 (D: magenta; G: light green; I: 443 blue; V: orange). For a detailed analysis, see Supplementary Figures 5-13. (A) The 444 structure of the SARS-CoV-2 spike trimer in its open conformation (chains are cyan, 445 magenta and grey) bound to the human receptor ACE2 (black) modeled based on PDB 446 accessions 6m17 and 6vyb. Identified nonsynonymous mutations are shown as spheres in 447 the model. For reasons of visibility only mutations of two of the three spike chains are 448 labeled. memb. indicates the plasma membrane. (B) Fragment comprising residues 180-534 of nsp2, modelled by AlphaFold³⁵. Both clade-defining mutations are located in 449 450 solvent-exposed regions and would not lead to steric clashes. (C) The substitution A876T 451 (corresponding to residue A58 in the nsp3 cleavage product numbering) is situated in the

452	N-terminal ubiquitin-like domain of nsp3. The structure of this domain can be inferred
453	based on the 79% identical structure of residues 1-112 from SARS-CoV (PDB id 2idy).
454	The substitution A876T can be accommodated with only minor structural adjustments and
455	is not expected to have a substantial influence on the proteins stability or function. (D) The
456	structure shows the nsp12 in complex with nsp7 (magenta) and nsp8 (cyan and teal), based
457	on PDB 7btf. P4720 (P323 in nsp12 numbering) is located in the 'interface domain' (black).
458	In this position, the P323L substitution is not predicted to disrupt the folding or protein
459	interactions and hence is not expected to have strong effects. (E) A theoretical model for
460	the Orf3a monomer has been proposed by AlphaFold ³⁶ . The structure-function relationship
461	of this protein remains to be clarified. The mutation G251V is located C-terminal to the β -
462	sandwich domain and the tail (marked by an asterisk).

463 Table 1. Sensitivity and specificity of the SARS-CoV-2 clade-defining SNP based on 2,058 genomes covering the first 14 weeks

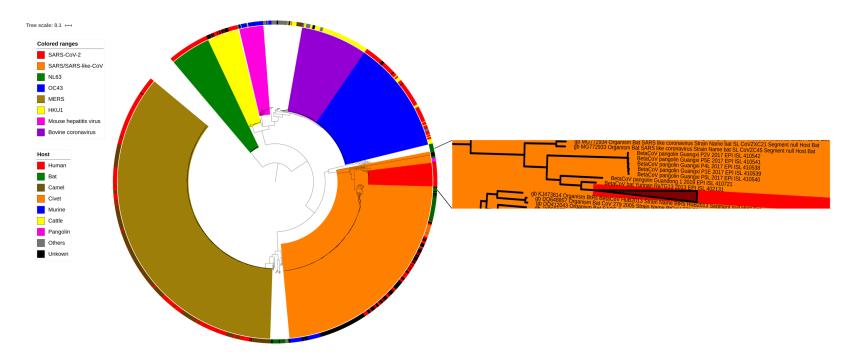
- **of the COVID-19 outbreak.**

Clade	E		Nucleotide	Amino Acid	True	False	False	True	Q., : C :	G
Defined	Event	ORF	Substitution	Substitution Substitution		Positive	Negative	Negative	Specificity	Sensitivity
V	E1	Orf3a	G26144T	Gly251Val	195	0	1	1862	1.000	0.995
Ι	E6	Orflab	G1397A	Val378Ile	54	0	0	2004	1.000	1.000
		N	T28688C		53	1	2	2002	1.000	0.964
D	E7	Orflab	G1440A	Gly392Asp	42	0	0	2016	1.000	1.000
		Orflab	G2891A	Ala876Thr	39	0	3	2016	1.000	0.929
S	E8	Orflab	C8782T		521	4	2	1531	0.997	0.996
		Orf8	T28144C	Leu84Ser	523	1	0	1534	0.999	1.000
G	E10	Orflab	C3037T		946	1	4	1107	0.999	0.996
		Orflab	C14408T	Pro4720Leu	948	1	2	1107	0.999	0.998
		S	A23403G	Asp614Gly	946	1	4	1107	0.999	0.996

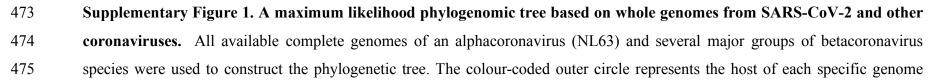
469 The genomic variation landscape of globally-circulating clades of SARS-CoV-2 defines a genetic

470 **barcoding scheme**

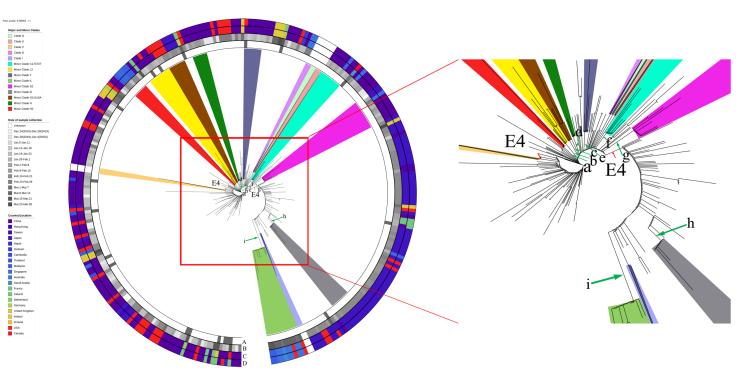
471 SUPPLEMENTARY FIGURES



472



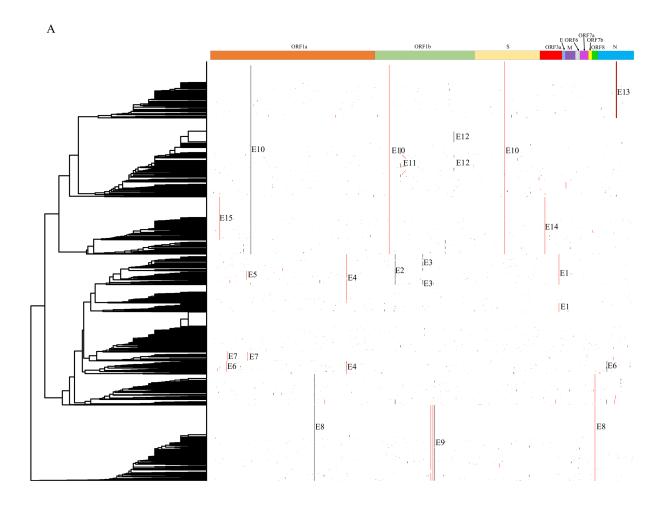
476 sequence. The SARS-CoV-2 part of the phylogenetic tree has been expanded for better resolution of the tree with closely related
477 viral species. A total of 1,427 SARS-CoV-2 whole genomes were illustrated in the phylogeny.



Event	Minor Clades	Nucleotide substitution	ORF	Amino Acid Substitution	First Date detected	Location first detected	Reference: EPI_ISL
а	H2	G27147C	М	p.Asp209His	2020/1/25	Singapore	407987
b	L2	C28854T	N	p.Ser194Leu	2020/1/16	China, Shenzhen	406594
с	G11410A	G11410A	ORF1a		2020/2/15	Japan, Diamond Princess cruise ship	416584
d	Н	G2293T	ORF1a	p.Gln676His	2020/2/4	China,Shanghai	416353
e	Y	C21707T	S	p.His49Tyr	2020/1/17	China,Zhuhai	403936
f	C17373T	C17373T	ORF1b		2020/1/22	China,Foshan	406536
a a a a a a a a a a a a a a a a a a a	S2	C15324T	ORF1b		2020/1/22	China,Guangzhou	406533
g	52	C29303T	Ν	p.Pro344Ser	2020/1/22	China,Guangzhou	
h	I2	C18656T	ORF1b	p.Thr6136Ile	2020/2/15	Japan, Diamond Princess cruise ship	416565
		C6312A	ORF1a	p.Thr2016Lys			417388
i	К	C13730T	ORF1b	p.Ala4494Val	2020/3/5	Association for the second	
	ĸ	C23929T	S		2020/3/3	Australia, Sydney	41/300
		C28311T	N	p.Pro13Leu			

479 Supplementary Figure 2: Minor clades SARS-CoV-2. For illustration purposes, the major clades have been collapsed and the central 480 part of the figure has been enlarged. Most of the genomes that cannot be assigned to any major clade are derived from Asian countries 481 indicative of high genetic diversity in the relatively early stages of the local epidemics and that a founder effect likely explains the 482 observations of single predominant clades in North America and Europe which exhibit a reduction in genetic diversity. These genomes obtained were further analysed and assigned to minor clades. A minor clade was defined with n≥5 cases of SARS-CoV-2 based on 483 484 phylogenetic and SNP analysis and the events associated with them are indicated by the green arrow. The information contained in the 485 concentric circles: A, the imported cases; B, the collection date of each genome at one-week resolution; C, collection locations of the 486 genomes; D exposure locations of the genomes.

487



В	Event Date first detected		Location first detected	Reference: EPI_ISL	
	E1	22-Jan-20	USA, CA	406036	
	E2	25-Jan-20	China, Hangzhou	415709	
	E3	26-Feb-20	UK, England	414011	
	E4	17-Jan-20	China, Yunnan	408480	
	E5	28-Feb-20	UK, England	414006	
	E6	18-Jan-20	China, Wuhan	412981	
	E7	25-Feb-20	Germany, North Rhine-Westphalia	414497	
	E8	5-Jan-20	China, Wuhan	406801	
	E9	20-Feb-20	USA, WA	413456	
	E10	28-Jan-20	Germany, Munich	406862	
	E11	22-Jan-20	France, Auvergne-Rhône-Alpes	417333	
	E12	27-Feb-20	Switzerland, Geneva	414019	
	E13	25-Feb-20	Germany, Baden Wuerttemberg	412912	
	E14	21-Feb-20	France, Hauts de France	418218	
	E15	21-Feb-20	France, Hauts de France	418218	

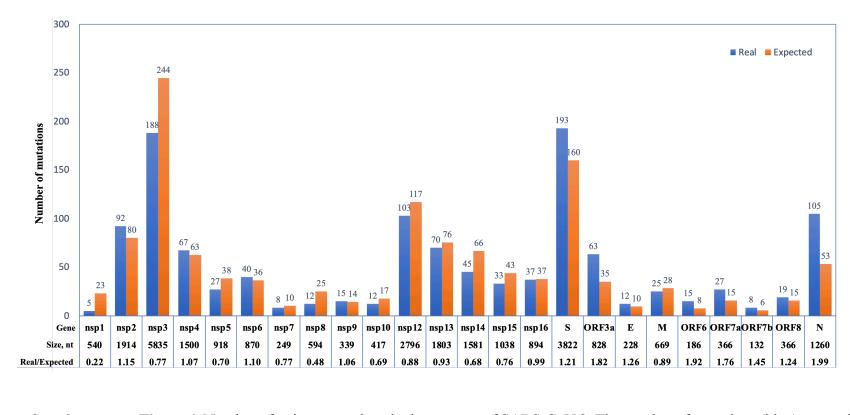
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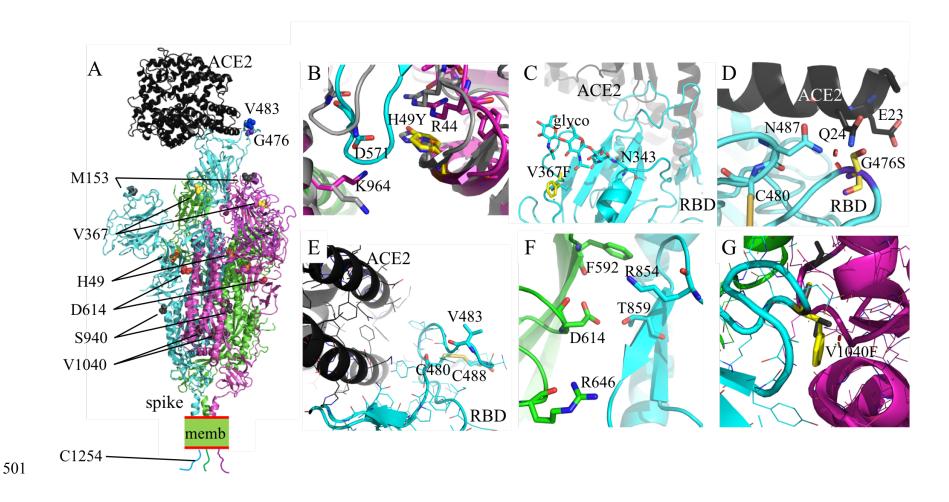
490 Supplementary Figure 3. The genomic position and details of SNPs in 2,058 SARS-

491 **CoV-2 genomes and the amino acid substitution eventss.** (A) Nonsynonymous

- 492 mutations are marked in red, and synonymous mutations are labeled in black. (B) The
- 493 first appearance and the location of each event



Supplementary Figure 4. Number of unique mutations in the genome of SARS-CoV-2. The number of mutations (blue) were taken
 from 2,058 available genomes from GISAID (March 31st 2020). The number of expected mutations (orange) were calculated based
 on the assumption that there are no purifying or selection pressures present against different categories of point mutations, and all
 of the mutations occurring randomly according to the size of each gene.



Supplementary Figure 5. Mutations in the SARS-CoV-2 spike protein. (A) An overview of an S trimer. The structure of the SARS-503 CoV-2 S trimer in its open conformation (chains are cyan, magenta and green) bound to the human receptor ACE2 (black) has been

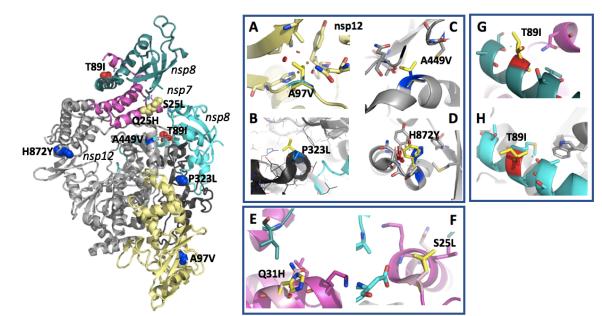
modeled based on PDB accessions 6m17 and 6vyb. Identified nonsynonymous mutations are shown as sphere models. For reasons of 504 visibility only mutations of two of the three S chains are labeled. Memb indicates the membrane. The cytoplasmic tails are depicted in 505 506 the same colours as the three spike chains. B-E) Magnified regions of the mutations. (B) H49Y: H49 is located in the N-terminal domain 507 (NTD) which is in contact with the sub-domain 2 (SD2) of a symmetry-related molecule. The relative position of NTD and SD2 changes 508 considerably upon going from the closed (grey coloured) to the open state (cyan and magenta). H49 stabilises the rim of the NTD 509 through cation- π -stacking with R44. A tyrosine in position 49 would be able to perform the same role and does not lead to clashes. 510 However, the substitution may slightly alter the stability of this interaction and the interaction between the NTD and SD2, which, in 511 turn, might have subtle effects on the stability and equilibrium of open and closed conformations of S. (C) V367F: V367 is part of the 512 receptor binding domain (RBD), however located too far away from the ACE2-binding site to directly affect receptor binding. V367 is 513 surface exposed, and its substitution would not create clashes with other protein regions. However, the exchange of a small with a bulky 514 hydrophobic residue would alter the surface characteristics of this region, which might influence the efficiency of glycosylation (stick model) of the nearby N343, or the positioning of the sugars. Additionally, the altered RBD surface could potentially interfere with 515 516 antibody recognition. (D) G476S: G476 is located in the RBD. It is positioned solvent-exposed in a SARS-CoV-2-specific loop. This 517 loop is stabilised by a disulphate bridge (C480:C488; C480 is shown as stick model). In the open, ACE2-bound conformation of the 518 RBD, G476 is close to ACE2 Q24 and E23. The substitution G476S would lead to light clashes with these ACE2 residues (indicated as 519 red spheres) and with the RBD residues N487. However, minor reorientation of the side chains might allow an additional hydrogen bond 520 to be formed between S476 and ACE2 Q24 and E23, thus enhancing the affinity. (E) V483A: V483 is also located in the RBD, solvent-521 exposed in the same SARS-CoV-2-specific loop as G476 (C480:C488 are shown as stick models). In the open, ACE2-bound conformation of the RBD, V483 is more than 10Å away from the ACE2 receptor, and hence does not contribute to direct binding or 522 523 stability. In the closed conformation, this loop is not modeled in the EM structures (PDB 6vyb), inferring it is flexible in the absence of

ACE2. Superimposition of the ACE2-bound conformation of the RBD onto RBDs in a closed conformation shows that this loop region 524 would stick out into the solvent. Substitution of V483 is consequently not predicted to have a strong impact on receptor binding or 525 526 protein stability. By lowering the hydrophobic surface, this substitution might however reduce the non-specific stickiness of this loop 527 region, and/or affect binding of antibodies. (F) D614G: D614 is located in the SD1. In the trimeric S, D612 engages stabilising 528 interactions within the SD1 (R646 or the backbone of F592, depending on the chain) and with the S1 of the adjacent chain (T859 and 529 K854). Replacement of D614 with a glycine would entail losing these stabilising interactions and increase the dynamics in this region. 530 (G) V1040F: V1040 is located in a loop region that makes hydrophobic contacts between stalk regions of the spike trimer. The V1040F 531 substitution is possible without steric hindrance, and would slightly increase the hydrophobic contacts between the chains. The other 532 mutations are not shown in detail, but are evaluated as follows. M153T: M153 is located in the NTD in a solvent-exposed loop. N electron density was modeled for this loop in the cryo-EM structure (6vyb) suggesting it is flexible. The substitution is expected to be 533 534 neutral. S940F: S940 is located in the stalk region, in a solvent-exposed turn. Introducing the bulkier phenylalanine in this position 535 would not destabilise the structure but locally change the surface characteristics. C1254F: C1254 is the last cysteine in a cysteine-rich 536 unstructured short cytoplasmic region. This region is required for efficient membrane fusion. The exact mechanism remains to be 537 elucidated, and hence we cannot assess the exact impact of the C1254F mutation.

RNA-	binding dor	nain	RNA	-binding dor (dimer)	main	_
IDR	NTD	LK	(R	CTD	IDR	
and and		G CTE C C C C C C C C C C C C C C C C C C	SRG	NTD	۶	_
1 <u>0</u> MSDNGPQNQR	2 <u>0</u> NAPRITFGGP	3 <u>0</u> SDSTGSNQNG	4 <u>0</u> ERSGARSKQR	5 <u>0</u> RPQGLPNNTA	6 <u>0</u> SWFTALTQHG	
7 <u>0</u> KEDLKFPRGQ	8 <u>0</u> GVPINTNSSP	_	10 <u>0</u> TRRIRGGDGK	11 <u>0</u> MKDLSPRWYF	_	
13 <u>0</u> LPYGANKDGI	14 <u>0</u> IWVATEGALN			17 <u>0</u> LPQGTTLPKG		
19 <u>0</u> QASSRSSSRS			_	23 <u>0</u> LLLLDRLNQL		— LKR — SR-rich
25 <u>0</u> QQGQTVTKKS	26 <u>0</u> AAEASKKPRQ	27 <u>0</u> krtatkaynv	28 <u>0</u> TQAFGRRGPE	29 <u>0</u> QTQGNFGDQE	30 <u>0</u> LIRQGTDYKH	
31 <u>0</u> WPQIAQFAPS	32 <u>0</u> ASAFFGMSRI			35 <u>0</u> DKDPNFKDQV		
37 <u>0</u> KTFPPTEPKK	38 <u>0</u> dkkkkadetq	39 <u>0</u> Alporokkoo		41 <u>0</u> DDFSKQLQQS	MSSADSTQA	

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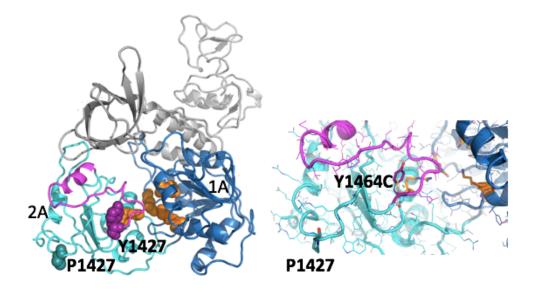
540 Supplementary Figure 6. Mutations in the SARS-CoV-2 nucleocapsid. The SARS-541 CoV-2 nucleoprotein (N) compacts the viral genome into a helical ribonucleocapsid and 542 hence has key roles in viral assembly¹. N contains two folded domains, the N-terminal and 543 the dimeric C-terminal domain (NTD; blue, and CTD; green, respectively). Both domains 544 are flanked by flexible regions, namely a flexible linker between them (LKR, underlined 545 in the bottom panel sequence) and ~ 40 residue intrinsically disordered regions (IDRs) as 546 tails. The NTD and CTD are RNA-binding regions, but the LKR and IDRs also affect 547 RNA-binding of N². The LKR contains a serine-arginine (SR)-rich region, which 548 contributes to RNA binding and N oligomerization. The arginines may promote RNA-549 binding through electrostatic interactions, whereas the serines are putative phosphorylation 550 sites that would counteract RNA binding and possibly favour oligomerisation upon 551 phosphorylation³. The hotspot mutations S202N, R203K and G204R are all within the SR 552 region of the LKR. S202N would delete a putative phosphorylation site. Given the large 553 number of alternative serine phosphorylation sites, and the presence of many asparagines 554 within the linker, this S/N substitution might not have a very strong influence. The 555 homologous substitution R203K is also expected to have only minor effects. G204R might 556 increase binding to RNA, and/or affect other homo- or heterologous interactions. In 557 summary, the substitutions might potentially enhance RNA binding and alter the response 558 to serine phosphorylation events. The structural figure consists of homology models for 559 the NTD and CTD, linked by arbitrary but stereochemically-plausible linker regions.



562 Supplementary Figure 7. Mutations in SARS-CoV-2 ORF1ab, nsp12: The nsp12 RNA-dependent RNA polymerase forms a complex with one nsp7 and two nsp8, which markedly enhances its polymerase activity⁴. The shown SARS-CoV-2 nsp12 structure is composed 563 564 of a nidovirus-unique N-terminal extension (pale yellow), a linker domain (black) and the RNA-dependent RNA polymerase (RdRp) 565 domain (grey). The structure shows the nsp12 in complex with nsp7 (magenta) and nsp8 (cyan and teal), based on PDB 7btf. (A) A4494 566 (A97 in nsp12 numbering; shown as a blue sphere models) is located in the N-terminal extension of the polymerase^{5,6}. A4494 is sealing 567 the hydrophobic core of the N-terminal lobe, and its side chain is not solvent exposed. Its replacement with the hydrophobic but slightly 568 bigger valine (yellow) only leads to minor clashes (small red discs) that would not have a significant impact on the function or stability. 569 (B) P4720 (P323 in nsp12 numbering) is located in the 'interface domain' (black). In this position, the P323L substitution (yellow) is

570 not predicted to disrupt the folding or protein interactions and hence is not expected to have strong effects. (C) A4846V (residue A449 in nsp12 numbering; blue) is located in the finger domain, with its side chain pointing inwards, contributing to a hydrophobic interaction 571 572 with the adjacent beta strand. The substitution of A4846 by a valine (yellow) is tolerated in this context. Leading only to minor clashes, 573 it might slightly improve the stability of this region. (D) H5269 (H872 in nsp12 numbering; blue) is located in the thumb domain. It is 574 at the tip of a solvent exposed turn, where its replacement by a tyrosine (yellow) would be tolerated without functional impact. 575 Nsp7: S2884 and Q3890 (S25 and Q31 in nsp7 numbering; both in light yellow) are solvent exposed on a helix that makes contact with 576 both nsp8 and nsp12. (E) S25 is capping the N-terminal end of this helix. Its substitution with a leucine (yellow) does not cause steric 577 problems, but would lead to loss of the capping hydrogen bond. However, D163 from one of the nsp8 molecules also performs a capping 578 function in the complex, and hence S25L would only have a slightly destabilising effect. (F) Q31 is located on the surface of the helix. 579 Although Q31 is close to nsp8, its substitution with a histidine (yellow) would not influence this interaction measurably. 580 Nsp8: Only T4031 (T89I in nsp8 numbering; red) is included in the structural model. In both nsp8 molecules, T89 is located solvent 581 exposed on a helix. In neither of the two nsp8 molecules would the substitution T89I create steric problem or affect the interaction with

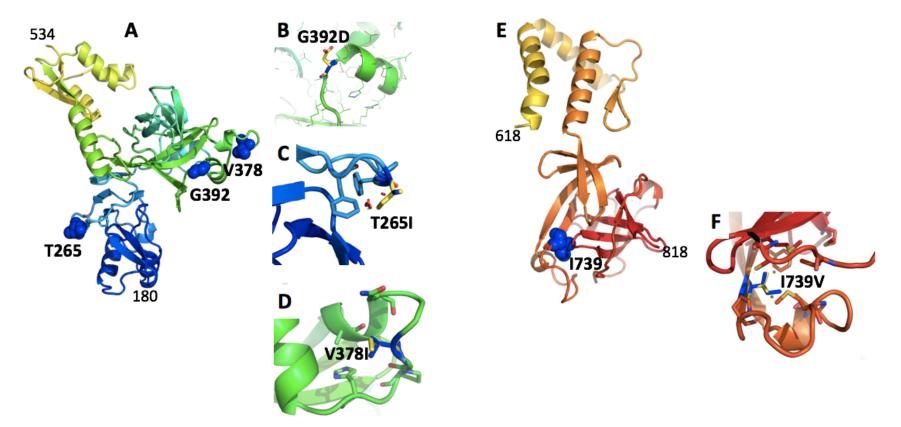
582 nsp12 or nsp7.



Nsp13, helicase

Supplementary Figure 8. Mutations in SARS-CoV-2 *ORF1ab*, nsp13: P1427L and Y1464C are both in the helicase nsp13, which catalyses the unwinding of duplex oligonucleotides into single strands. Both residues are located on the same side of the 2A domain of the helicase. The 2A and adjacent 1A domains coordinate together to complete the final unwinding process. The helicase has been modelled based on the 99.8% identical SARS nsp13 (PDB id 6jyt). The domains 1A and 2A are coloured in blue and cyan, respectively. The residues involved in NTP binding are shown in orange. Residues on domain 2A that are involved in RNA binding are shown in magenta. The other domains are grey. *Left*: overview of the complete structure. Key residues are shown as sphere models. *Right*: zoom into the mutated area. Key residues are shown as stick models. For Y1464 the *in silico* mutated cysteine is shown in white. P1427 is

- 591 located in a solvent-exposed loop region that has not yet reported to be involved in nucleotide binding. Its substitution with a leucine is
- 592 not expected to create noticeable effects. Y1464 is part of a region that contributes to binding and unwinding of duplex oligonucleotides⁷.
- 593 Its substitution by a cysteine would decrease the stability and enhance the dynamics of this particular region, and might affect RNA
- 594 binding and processing.

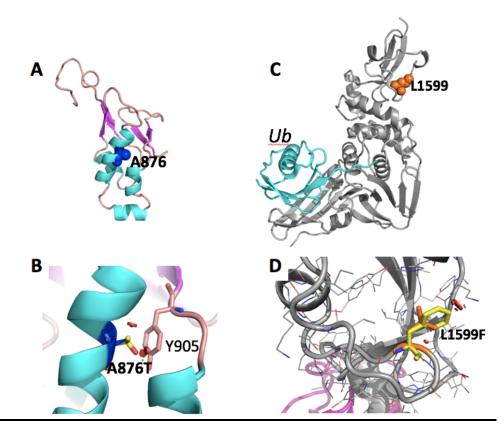


596 Supplementary Figure 9. Mutations in SARS-CoV-2 ORF1a: nsp2.

597 No experimental structure of sufficiently close homologue is known for nsp2. This structural analysis is therefore based on the proposed 598 theoretical AlphaFold model. (A) Shown is a model for residues 180-534, colour ramped from blue to yellow. T265 and G392 are shown 599 as blue sphere models. (B) T265 (blue stick model, corresponding to residue T58 in the nsp2 cleavage product numbering) is located at

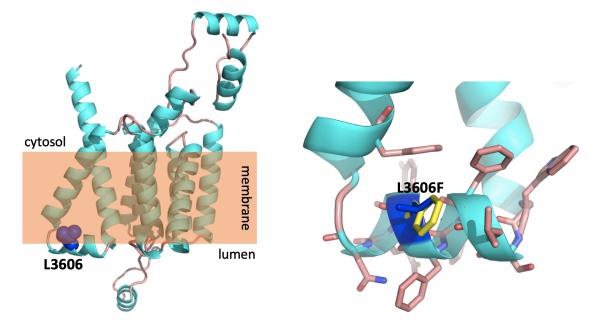
600 the tip of a loop that is pinned to the core of the N-terminal domain (blue) via hydrophobic residues (two phenylalanines are shown as

601 stick models). Being exposed to the solvent, the T265I substitution (shown in yellow) is not expected to have significant impact on 602 protein fold or function. (C) G392 (G212 in nsp2 numbering; shown in blue) is placed in a solvent accessible loop, according to the 603 AlphaFold model. In this position even the non-conservative substitution with an aspartic acid (yellow) is not predicted to have 604 significant impact on protein fold or function. (D) V378 is located in a surface exposed loop. Its substitution by an isoleucine will not 605 create steric clashes, nor lead to loss of hydrophobic interactions. (E) A second nsp2 fragment is shown, colour ramped from yellow to 606 red, comprising residues 618 to 818. I793 is shown as blue sphere model. (F) I739V (I559 in nsp2 numbering; shown in blue) is part of 607 a hydrophobic core of a small C-terminal domain. Its substitution with an only slightly smaller hydrophobic valine (yellow) would only 608 have insignificant destabilising effects on this region.

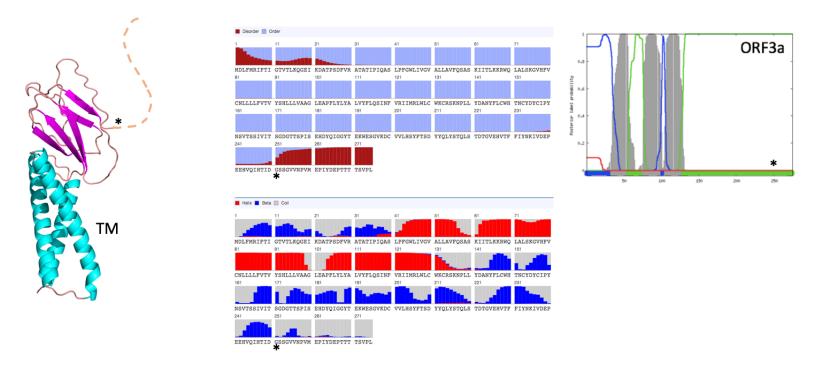


Supplementary Figure 10. Mutations in SARS-CoV-2 ORF1a: nsp3. The substitution A876T (corresponding to residue A58 in the nsp3 cleavage product numbering) is situated in the N-terminal ubiquitin-like domain of nsp3. (A) The structure of this domain can be inferred based on the 79% identical structure of residues 1-112 from SARS-CoV (PDB id 2idy). Helices are coloured in cyan, strands in magenta and loops in pale orange. A876 is shown as blue sphere model. (B) Zoom onto A876. A876 (blue stick model) is placed within a helix, engaging hydrophobic contacts with Y905 (stick model). The substitution into a slightly larger threonine (yellow stick

- 615 model) can be accommodated with only minor structural adjustments (clashes are shown as red spheres) and hence the A876T mutation
- 616 is not expected to have a substantial influence on the proteins stability and function. (C) L1599F is located in the papain-like protease.
- 617 The structure (grey) has been modelled based on the ~83% identical SARS-CoV structures in complex with ubiquitin (Ub, cyan, based
- 618 on 4m0w). L1599 is remote from the active site in the Ubl domain. (D) Its substitution does not lead to clashes and is expected to be
- 619 neutral in terms of function and protein stability. No templates have been identified for V378I.

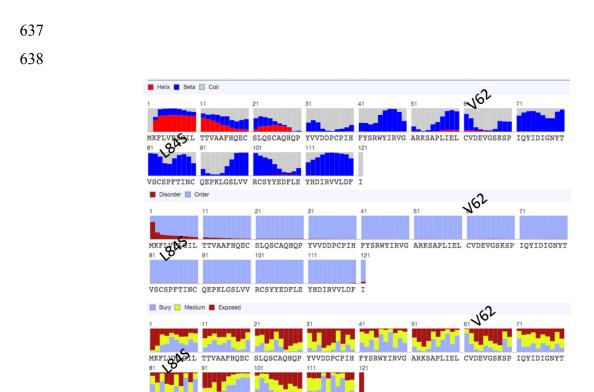


Supplementary Figure 11. Mutations in SARS-CoV-2 *ORF1a*: nsp6. L3606 (corresponding to residue L37 in the nsp6 cleavage product) is a multi-pass transmembrane protein for which no experimental structure of sufficiently close homologue is known. This structural analysis is therefore based on the proposed theoretical AlphaFold model (*Left*). Helices are colored in cyan, loops in pale orange. L3606 is shown as blue sphere model. The endoplasmic reticulum membrane is shown in orange; lumen and cytoplasmic sides are indicated. *Right*: close-up view of the location of L3606 (shown as blue stick model). L3606 is located in a predicted helical region that is partly submerged in the membrane, lying parallel to its luminal surface. According to the structural model, L3606 is exposed to the membrane, and hence its substitution with a larger but still hydrophobic phenylalanine would not impact structure or function.



Supplementary Figure 12. Mutations in SARS-CoV-2 *ORF3a*. ORF3a is a viroporin that forms a pentameric potassium-sensitive ion channel. ORF3a activates the inflammasome which facilitates viral release and aggravates disease symptoms⁸. ORF3a contains a 3-pass α -helical TM region (cyan in left panel, and greyed regions in TM prediction, right panel) and a domain predicted to have a β-sandwich fold (magenta; see also middle panel and right panel). The ORF3a N- and C-terminal tails are predicted to be disordered (middle panel, top). A theoretical model for the Orf3a monomer has been proposed by AlphaFold⁹. The structure-function relationship of this protein remains to be clarified. The mutation G251V is located C-terminal to the β-sandwich domain and the tail (marked by an asterisk). In this position, the substitution is not expected to affect the protein fold or function significantly.

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QEPKLGSLVV RCSYYEDFLE YHDIRVVLDF

VSCSPFTINC

639

640

Supplementary Figure 13. Mutations in SARS-CoV-2 ORF8. ORF8 has an N-terminal 641 642 sec-pathway signal peptide with a cleavage site after residue 15, suggesting that it is 643 secreted into the extracellular space. Following signal peptide cleavage, the ORF8 protein 644 core is predicted to consist largely of β -strands and features seven cysteines (top panel). 645 We predict that this protein adopts a cysteine disulfide-bond stabilised β -sandwich 646 structure inferring that ORF8 also functions as a ligand binding module. Homology 647 modeling or *ab initio* servers failed to produce a model consistent with the proteins' 648 secondary structure predictions. V62 and L84 are predicted to be partially solvent-exposed 649 (bottom), and located at the end (V62) or in the middle (L84) of secondary structural 650 elements (depending on the prediction server, the region surrounding V62 is predicted as 651 strand or helix; L84 is in a β strand). Hence, we can only speculate that the mutations V62L 652 and L84S might have little effect on the stability of the disulphate-stabilised fold, but might 653 have minor (or no) effects on ligand binding.

654 SUPPLEMENTARY TABLES

655 **Supplementary Table 2**. Experimentally validated amino acid substitutions resulting in escape mutants or having functional

656 significance in N and S proteins of SARS-CoV and MERS-CoV.

657	Protein	Protein Residue Virus		Substitution in SARS-CoV-2	GISAID (EPI_ISL)	Functional role of the residue	Reference
_		T149	SARS-CoV	T148I	406595	T149 is an epitope that interacts with neutralising antibody.	10
	N	K250	SARS-CoV	K249I	408515	K250 is an essential motif for binding SN5-25 antibody.	10
		S328	SARS-CoV	S327L	413557	S328 forms inter-dimer disulfide bonds connecting the two β -strands.	11
_	S	R395	SARS-CoV	R408I	413522	R395 interacts with one of the most potent neutralising antibody m396.	12
		D463	SARS-CoV	G476S	417085, 417380, 418055, 418077, 417353, 41708, 416447	D463G is associated with neutralisation escape from MAbs S224.1.	13
		1529	MERS-CoV	V483A	414618, 415596, 415605, 417072, 417073, 417075, 417076, 417111, 417139, 417159, 417160, 418029, 418071	I529T reduces affinity of RBD to the DPP4/CD26 receptor.	14

658 SUPPLEMENTARY REFERENCES:

- Chang, C. K., Hou, M. H., Chang, C. F., Hsiao, C. D. & Huang, T. H. The SARS coronavirus nucleocapsid protein Forms and
 functions. *Antiviral Research* (2014). doi:10.1016/j.antiviral.2013.12.009
- Chang, C.-K. *et al.* Multiple Nucleic Acid Binding Sites and Intrinsic Disorder of Severe Acute Respiratory Syndrome
 Coronavirus Nucleocapsid Protein: Implications for Ribonucleocapsid Protein Packaging. *J. Virol.* (2009).
- 663 doi:10.1128/jvi.02001-08
- 664 3. Peng, T. Y., Lee, K. R. & Tarn, W. Y. Phosphorylation of the arginine/serine dipeptide-rich motif of the severe acute
- respiratory syndrome coronavirus nucleocapsid protein modulates its multimerization, translation inhibitory activity and cellular localization. *FEBS J.* **275**, 4152–4163 (2008).
- 667 4. Subissi, L. *et al.* One severe acute respiratory syndrome coronavirus protein complex integrates processive RNA polymerase
 668 and exonuclease activities. *Proc. Natl. Acad. Sci. U. S. A.* (2014). doi:10.1073/pnas.1323705111
- 669 5. Gao, Y. et al. Structure of the RNA-dependent RNA polymerase from COVID-19 virus. Science 7498, 1–9 (2020).
- 670 6. Kirchdoerfer, R. N. & Ward, A. B. Structure of the SARS-CoV nsp12 polymerase bound to nsp7 and nsp8 co-factors. *Nat.* 671 *Commun.* (2019). doi:10.1038/s41467-019-10280-3
- 672 7. Jia, Z. *et al.* Delicate structural coordination of the Severe Acute Respiratory Syndrome coronavirus Nsp13 upon ATP
 673 hydrolysis. *Nucleic Acids Res.* (2019). doi:10.1093/nar/gkz409
- 8. Siu, K. L. *et al.* Severe acute respiratory syndrome Coronavirus ORF3a protein activates the NLRP3 inflammasome by
- 675 promoting TRAF3-dependent ubiquitination of ASC. *FASEB J.* (2019). doi:10.1096/fj.201802418R

- G76 9. John Jumper, Tunyasuvunakool, K., Kohli, P. & Hassabis, D. Computational predictions of protein structures associated with
 G77 COVID-19. (2020). Available at: https://deepmind.com/research/open-source/computational-predictions-of-protein-structures G78 associated-with-COVID-19.
- 679 10. Lin, Y. *et al.* Identification of an epitope of SARS-coronavirus nucleocapsid protein. *Cell Res.* (2003).
 680 doi:10.1038/sj.cr.7290158
- Chang, C. ke, Chen, C. M. M., Chiang, M. hui, Hsu, Y. lan & Huang, T. huang. Transient Oligomerization of the SARS-CoV N
 Protein Implication for Virus Ribonucleoprotein Packaging. *PLoS One* (2013). doi:10.1371/journal.pone.0065045
- Tian, X. *et al.* Potent binding of 2019 novel coronavirus spike protein by a SARS coronavirus-specific human monoclonal
 antibody. *Emerging Microbes and Infections* (2020). doi:10.1080/22221751.2020.1729069
- Rockx, B. *et al.* Escape from Human Monoclonal Antibody Neutralization Affects In Vitro and In Vivo Fitness of Severe Acute
 Respiratory Syndrome Coronavirus. *J. Infect. Dis.* (2010). doi:10.1086/651022
- Kim, Y. *et al.* Spread of mutant middle east respiratory syndrome coronavirus with reduced affinity to human CD26 during the
 south Korean outbreak. *MBio* (2016). doi:10.1128/mBio.00019-16