

1 **Title: Evolutionary differences in the ACE2 reveals the molecular**
2 **origins of COVID-19 susceptibility**

3
4 **Authors: Ryan R. Cheng^{1*}, Esteban Doderro-Rojas¹, Michele Di Pierro^{1,2}, José**
5 **N. Onuchic^{1,3,4,5,*}**

6
7 **Affiliations:**

8 ¹ Center for Theoretical Biological Physics, Rice University, Houston, Texas 77005.

9 ² Department of Physics, Northeastern University, Boston, Massachusetts 02115.

10 ³ Department of Chemistry, Rice University, Houston, Texas 77005.

11 ⁴ Department of Physics & Astronomy, Rice University, Houston, Texas 77005.

12 ⁵ Department of Biosciences, Rice University, Houston, Texas 77005.

13 *To whom the correspondence should be addressed: ryan.r.cheng@gmail.com, jonuchic@rice.edu

14

15 **Abstract:**

16 We explore the energetic frustration patterns associated with the binding between the SARS-CoV-
17 2 spike protein and the ACE2 receptor protein in a broad selection of animals. Using energy
18 landscape theory and the concept of energy frustration—theoretical tools originally developed to
19 study protein folding—we are able to identify interactions among residues of the spike protein and
20 ACE2 that result in COVID-19 resistance. This allows us to identify whether or not a particular
21 animal is susceptible to COVID-19 from the protein sequence of ACE2 alone. Our analysis
22 predicts a number of experimental observations regarding COVID-19 susceptibility,
23 demonstrating that this feature can be explained, at least partially, on the basis of theoretical means.

24

25

26 **Introduction**

27

28 The coronavirus disease 2019 (COVID-19) caused by the severe acute respiratory syndrome
29 coronavirus 2 (SARS-CoV-2) has affected the lives of millions of people in a worldwide
30 pandemic. The hallmark of COVID-19 is its high degree of contagiousness between individuals.

31

32 SARS-CoV-2 is believed to gain entry in to the host cell through its interaction with the
33 Angiotensin-converting enzyme 2 (ACE2) receptor on the host cell surface(Zhou et al., 2020),
34 similar to SARS-CoV-1(Li et al., 2003). Recently, the structure of the SARS-CoV-2 viral spike
35 glycoprotein bound to the human ACE2 receptor was determined using X-ray crystallography
36 (Wang et al., 2020), providing a crucial starting point for any molecular modeling of the viral
37 interaction with ACE2. The structure of this crucial complex has also been independently
38 determined using cryo-EM(Yan et al., 2020) and X-ray crystallography(Shang et al., 2020).

39

40 What are the molecular interactions that give rise to interaction specificity between the viral
41 spike and ACE2 receptor? Hints at the molecular origins of COVID-19 susceptibility can be
42 found analyzing the susceptibility of different organisms to the coronavirus. The ACE2 receptors
43 are found in a diverse span of the animal kingdom, including mammals, birds, and aquatic life,
44 which have varying degrees of COVID-19 susceptibility(BS et al., 2021; Gautam, Kaphle,
45 Shrestha, & Phuyal, 2020; Goldstein, 2020; Kumakamba et al., 2020; Muñoz-Fontela et al.,
46 2020; Mykytyn et al., 2020; Oude Munnink et al., 2021; Palmer et al., 2021; Shi et al., 2020; Sia
47 et al., 2020; Sit et al., 2020).

48

49 For example, it is known that mice are immune to COVID-19 while on the contrary the Bronx
50 Zoo tiger Nadia(Goldstein, 2020) had tested positive for COVID-19 and also exhibited many of
51 the symptoms observed in infected humans. To date, a number of animals have been classified as
52 either being susceptible or immune to COVID-19(BS et al., 2021; Gautam et al., 2020;
53 Goldstein, 2020; Kumakamba et al., 2020; Muñoz-Fontela et al., 2020; Mykytyn et al., 2020;
54 Oude Munnink et al., 2021; Palmer et al., 2021; Shi et al., 2020; Sia et al., 2020; Sit et al., 2020).

55

56 The evolutionary divergence in the sequences of the ACE2 receptor found in different organisms
57 can be related to such susceptibility of infection(Becker et al., 2020; Damas et al., 2020; Frank,
58 Enard, & Boyd, 2020; Lam et al., 2020; Luan, Lu, Jin, & Zhang, 2020; Martínez-Hernández et
59 al., 2020; Melin, Janiak, Marrone, Arora, & Higham, 2020). Here, we explore the molecular
60 mechanisms by which some sequence variants of the ACE2 receptor appear to confer resistance
61 to infection by virtue of their reduced binding affinity to the viral spike protein. We examine the
62 sequences for ACE2 receptor across a selection of 63 representative animals and identify the
63 residue interactions that are responsible for the reduced binding affinity, and thus COVID-19
64 resistance, using the concept of energetic frustration from the theory of protein folding (Onuchic,
65 Luthey-Schulten, & Wolynes, 1997; Onuchic & Wolynes, 2004). Here, energetic frustration
66 refers to unfavorable interactions between residues in a given protein structure that cannot be
67 mitigated without structural rearrangement or residue level mutations. In the context of the
68 ACE2/spike complex, frustrated interactions between residues of the ACE2 and the spike
69 glycoprotein can also exist for a given structure of the protein complex.

70

71 The rarity of kinetics traps observed in the folding of proteins indicates that, in general, proteins
72 do not exhibit a high amount of energetic frustration, which would instead create those kinetic
73 traps(Onuchic et al., 1997; Onuchic & Wolynes, 2004). While folding kinetics suggest proteins
74 to be “minimally frustrated”, some local frustration may be present; for example, local
75 frustration could be functionally useful for tuning conformational dynamics. In protein
76 complexes, a site frustrated in the monomeric protein may become less frustrated when the
77 protein is bound to its counterparts, thus guiding specific association(Ferreiro, Hegler, Komives,
78 & Wolynes, 2007; Parra et al., 2016).

79 In the case of the complex formed between the SARS-CoV-2 viral spike glycoprotein and the
80 ACE2 receptor, we use changes in energy frustration as a proxy for changes in binding affinity.

81 We use the crystal structure of the viral spike bound to the human ACE2 as a template to
82 construct molecular models of the interaction between the viral spike and the ACE2 receptors of
83 these different animals. We then calculate the changes in frustration with respect to the reference
84 point constituted by the human ACE2 sequence (Ferreiro et al., 2007; Parra et al., 2016). This
85 allows us to identify key residues of the ACE2 protein that appear to inhibit the binding of the
86 spike glycoprotein and to predict whether or not a particular animal will be susceptible to

87 COVID-19. The novelty of our approach and the key to our results resides in the fact that, while
88 our procedure is based on the only input of the protein sequences of ACE2 receptor, our
89 approach does incorporate a great deal of structural information about the protein complex,
90 which is extracted from the crystal structure(Wang et al., 2020), and physico-chemical details
91 about the energetics of protein folding and docking, which is synthesized in the energy function
92 and results from decades of developments(Onuchic & Wolynes, 2004).

93

94

95

96

97 **Materials & Methods**

98 **ACE2 protein sequences**

99 The majority of ACE2 protein sequences were previously annotated from the genome assemblies
100 and sequencing data from the DNA Zoo Consortium(Dudchenko et al., 2017) (Available for
101 download: <https://www.dnazoo.org/post/the-first-million-genes-are-the-hardest-to-make-r>). The
102 full length protein sequences of the ACE2 proteins for mouse (*Mus musculus*), ferret (*Mustela*
103 *putorius furo*), chicken (*Gallus gallus domesticus*), pig (*Sus*), duck (*Anas platyrhynchos*), Syrian
104 golden hamster (*Mesocricetus auratus*), and mink (*Neovison vison*) were obtained from the
105 Uniprot database(The UniProt, 2021) to supplement the sequences derived from the DNA Zoo.
106 In total, 63 representative ACE2 sequences were used in our study (Table S1). For comparative
107 analysis, a multiple sequence alignment was generated for the ACE2 sequences using Clustal
108 Omega(Madeira et al., 2019).

109

110

111 **Homology Modeling**

112 The crystal structure of the SARS-Cov-2 glycoprotein spike bound to the human ACE2 protein
113 served as our starting template for constructing models of the glycoprotein spike bound to the
114 ACE2 protein of other animals. We used the SWISS-MODEL (Waterhouse et al., 2018) to create
115 homology models of 63 representative animals (Table S1) for a full list.

116

117

118 Frustration Analysis

119 We performed an energy landscape analysis on the predicted ACE2-spike complex for different
120 animals using the configurational frustration index (Ferreiro et al., 2007; Parra et al., 2016):

$$121 \quad F_{ij} = \frac{\left(H_{ij} - \langle H_{i'j'}^{decoy} \rangle \right)}{\sqrt{\frac{1}{N} \sum_{k=1}^N \left(H_{i'j'} - \langle H_{i'j'}^{decoy} \rangle \right)^2}} \quad (1)$$

122 Here, H_{ij} represents the pairwise interaction energy between residues i and j in a given structure
123 using the Associative Memory, Water Mediated, Structure and Energy Model

124 (AWSEM) (Davtyan et al., 2012), a coarse-grained model widely used to study problems of
125 protein folding and protein-protein association and assembly. The native energies H_{ij} are

126 compared directly to N number of different configurational realizations between residues i and j ,

127 thereby generating a distribution of decoy energies with a mean of $\langle H_{i'j'}^{decoy} \rangle$ and a standard

128 deviation of $\sqrt{N^{-1} \sum_{k=1}^N \left(H_{i'j'} - \langle H_{i'j'}^{decoy} \rangle \right)^2}$. Hence, F_{ij} is a type of Z-score that measures how

129 favorable a particular pair of interactions are within a protein or protein complex with respect to

130 a distribution of decoys. Frustrated (unfavorable interactions) are denoted by $F_{ij} < 0$ while $F_{ij} > 0$

131 are considered favorable; in particular, $F_{ij} < -1$ is considered highly frustrated while $F_{ij} > 1$ is

132 considered minimally frustrated.

133

134 In our analysis, we found that it was useful to compare the configurational frustration between an
135 interprotein residue pair with the same pair from the human ACE2-spike complex:

$$136 \quad \Delta F_{ij}^{(Species)} = F_{ij}^{(Species)} - F_{ij}^{(Human)} \quad (2)$$

137 We find that $\Delta F_{ij}^{(Species)} < -1.5$ robustly identifies highly frustrated interactions that result in

138 COVID-19 resistance. On the other hand, if all of the inter-protein residue interactions between

139 the ACE2 receptor and the spike do not exhibit high levels of frustration (i.e., $\Delta F_{ij}^{(Species)} > -1$)

140 we identify that species as being highly susceptible to COVID-19. For completeness, if the most

141 frustrated interprotein interactions fall between $-1.5 < \Delta F_{ij}^{(Species)} \leq -1$ that species is predicted to
142 be moderately susceptible.

143

144 **Evolutionary distance between ACE2 proteins**

145 The Jukes-Cantor distance is used to quantify the evolutionary distance between aligned ACE2

146 proteins in our study: $d = -\frac{19}{20} \log\left(1 - \frac{20}{19} p\right)$, where p is the p-distance—i.e., the number of

147 residue sites between two compared sequences that are different divided by the sequence length
148 of the multiple sequence alignment.

149

150

151 **Results & Discussion**

152 **Comparative frustration analysis of ACE2-spike complex for different species**

153 By examining the comparative differences between the inter-protein interactions with respect to
154 the human ACE2-spike complex, we are able to identify residue-interactions outliers that
155 represent a significant disruption to the ACE2/spike interaction relative to the human ACE2-
156 spike interaction.

157

158 Shown in Figure 1 are plots of our frustration analysis for mouse (*Mus musculus*) and tiger
159 (*Panthera tigris*), which are used as representative examples of animals have been
160 experimentally observed to be resistant(Muñoz-Fontela et al., 2020) and susceptible(Goldstein,
161 2020) to COVID-19, respectively.

162 We observe a single frustrated residue pair between 31N of the mouse ACE2 and 484E of the
163 spike protein on the map of configurational frustration (Figure 2A/2C), which appears as an
164 outlier in the histogram of $\Delta F_{ij}^{(Mouse)} \sim -2$. Similar highly frustrated outliers can be found for the
165 other animals that are known to resist COVID-19 (Figure S1), such as chicken (*Gallus gallus*
166 *domesticus*)(Shi et al., 2020) and duck (*Anas*)(Shi et al., 2020). We find that a threshold value of
167 $\Delta F_{ij}^{(Species)} < -1.5$ robustly identifies residue pairs that appear to confer COVID-19 resistance.

168 Likewise, a histogram of $\Delta F_{ij}^{(Tiger)}$ exhibits comparable levels of frustration to that of the human

169 ACE2 and spike (Figure 1B)—similar findings are obtained for other animals with known
170 susceptibilities to COVID-19 (Figure S2), such as white-tailed deer (*Odocoileus*
171 *virginianus*)(Palmer et al., 2021), European rabbit (*Oryctolagus cuniculus*)(Mykytyn et al.,
172 2020), and pig (*Sus scrofa*)(BS et al., 2021).

173

174 We further apply this analysis for identifying frustrated outliers in our other modeled complexes,
175 thereby predicting whether a particular animal is susceptible to COVID-19. A detailed summary
176 of our results is shown in Figure 2, which includes experimental observations that corroborate or
177 are inconsistent with our predictions. Other animals that have been experimentally observed to
178 be susceptible to COVID-19, such as mink (*Neovison vison*) (Oude Munnink et al., 2021), and
179 Syrian golden hamster (*Mesocricetus auratus*)(Sia et al., 2020), are identified as being
180 moderately susceptible by our computational approach. Coronavirus consensus PCR-primer
181 sequences have been detected with high frequency in populations of straw-colored fruit bats
182 (*Eidolon helvum*)(Kumakamba et al., 2020), which have been predicted to exhibit moderate
183 susceptibility by the computational approach.

184

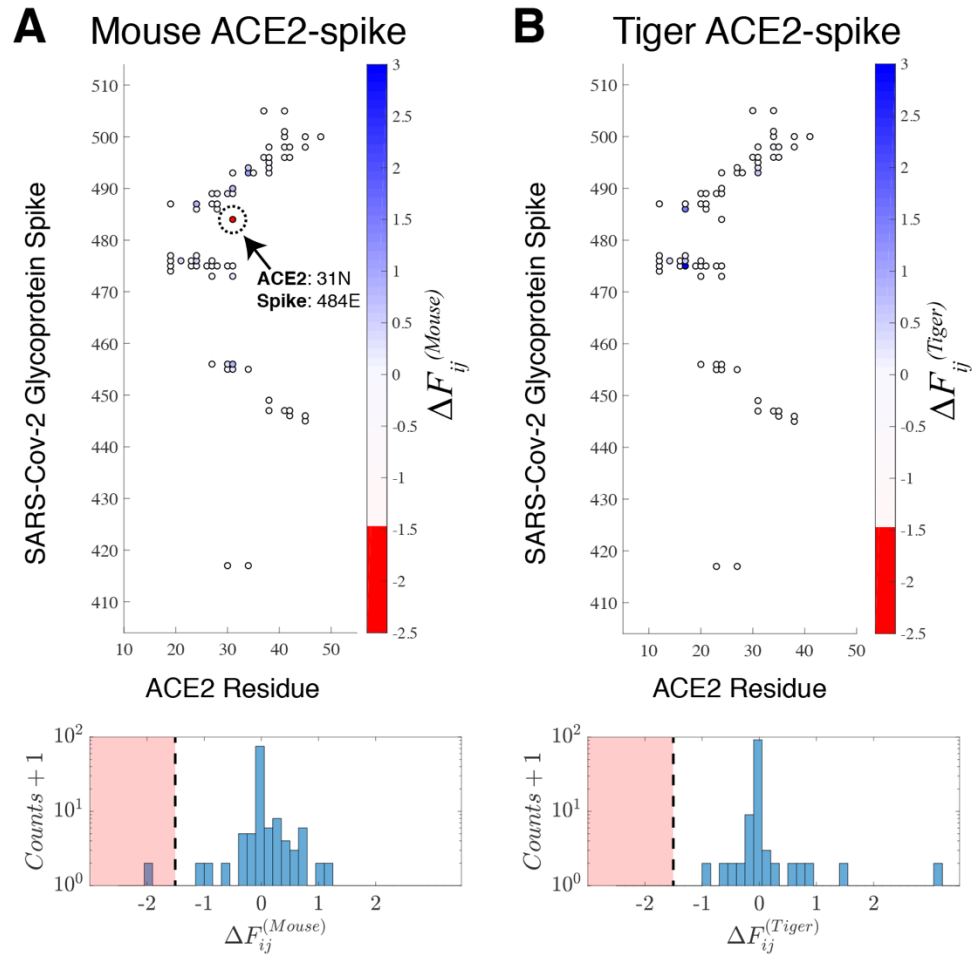
185 Taken together, our findings summarized in Figure 2 show that an energy landscape-based
186 approach can identify the molecular origins of COVID-19 susceptibility and resistance.
187 Experimental observations corroborate 10 out of 12 of the computational predictions. One
188 apparent inconsistency between the predictions and experimental observation regards the
189 susceptibility of ferrets (*Mustela putorius furo*), which have been observed to replicate SARS-
190 Cov-2 specifically in their upper respiratory tract(Shi et al., 2020). Our analysis of the ferret
191 ACE2-spike complex reveals a single highly frustrated inter-protein interaction between 34Y of
192 ACE2 and 403R of the spike protein. However, it has been noted(Damas et al., 2020; Shi et al.,
193 2020) that ferrets have a unique respiratory biology, which may offer an explanation for this
194 apparent discrepancy. Another apparent inconsistency is observed with our predictions for dogs
195 (*Canis lupus familiaris*). Our frustration analysis predicts two highly frustrated inter-protein
196 contacts within the ACE2/spike complex: 33Y of ACE2 with 417K of the spike and 325E of the
197 ACE2 with 502G of the spike. Yet the susceptibility of dogs still remains somewhat
198 controversial—while viral susceptibility and the production of antibody responses have been
199 detected in dogs(Sit et al., 2020), viral replication has been reported to be poor(Shi et al., 2020).

200

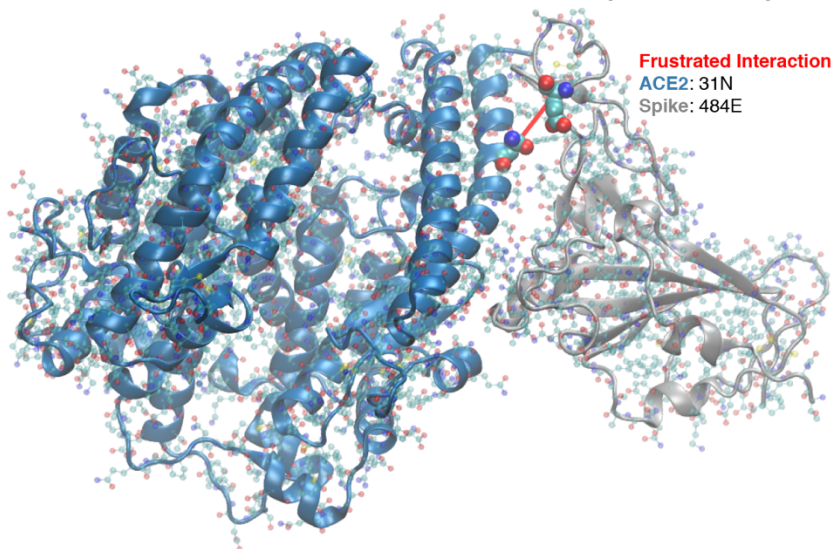
201 Our energy landscape-based predictions for COVID-19 susceptibility are closely related to
202 similar approaches that examined sequence differences in ACE2 sequences of different animals
203 in the context of a structural model of the ACE2/spike complex(Damas et al., 2020; Lam et al.,
204 2020; Luan et al., 2020). Frustration analysis yields a benefit to computational estimates of
205 binding affinity because it compares the interaction energies between ACE2 and the spike
206 glycoprotein with respect to alternative configurations (i.e., decoys) to assess how favorable a
207 particular interaction is in the binding interface. In particular, the majority of our predictions are
208 consistent with those of Damas et al(Damas et al., 2020), which makes predictions that are
209 consistent with the same 10 out of 12 experiment observations that are highlighted in Figure 2.
210 However, validation of the different models that exists is limited by the relatively small number
211 of confirmed cases of COVID-19 in animals.

212

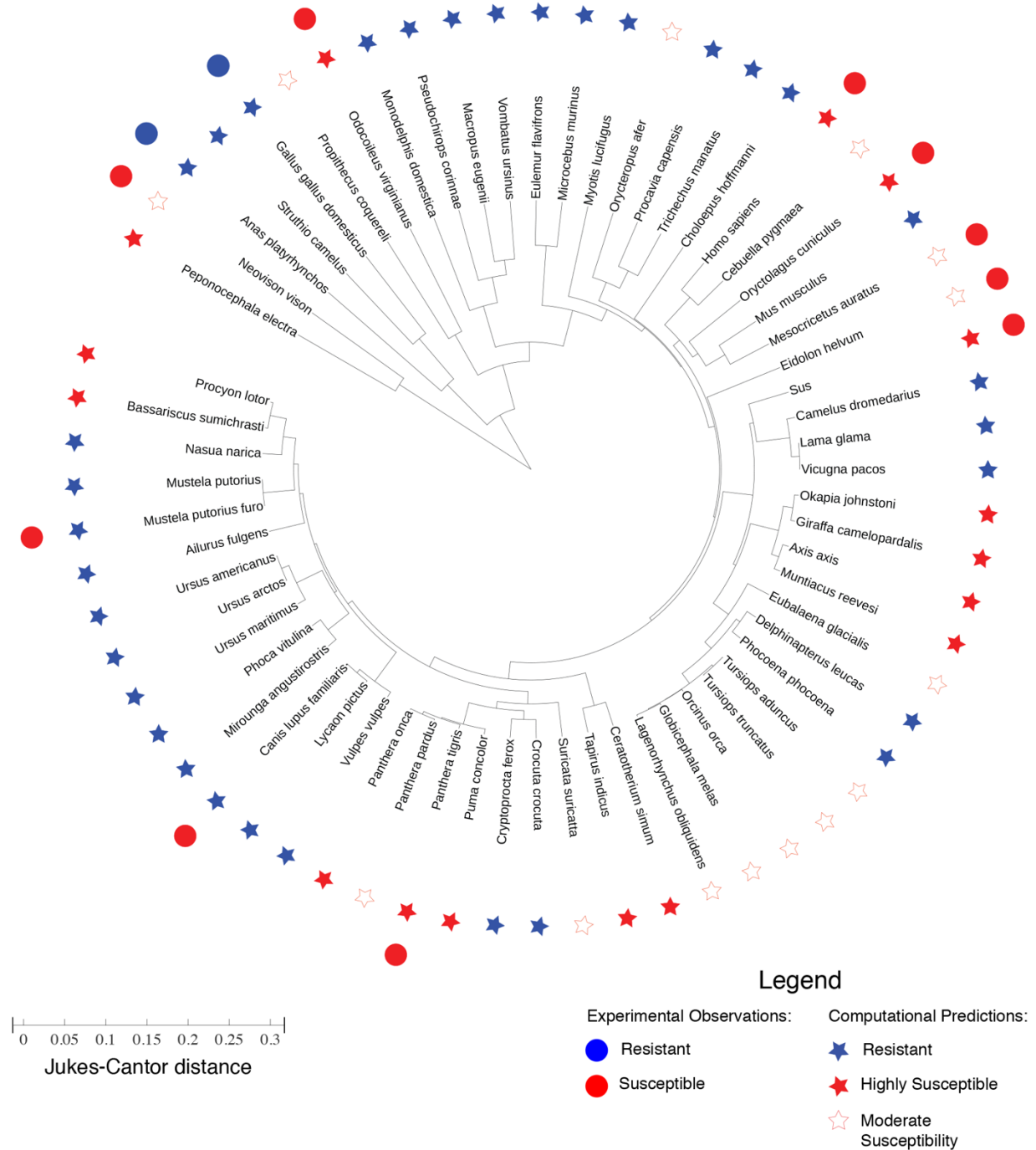
213 By in large, we find that our simple model appears to be consistent with many experimental
214 observations of COVID-19 infections across different animals despite only considering the
215 ACE2-spike protein interaction.



C Predicted Structure of Mouse ACE2-spike Complex



218 **Figure 1. Comparative analysis of the frustration indices with respect to those observed in**
219 **human ACE2-spike complex reveals outliers that indicate COVID-19 resistance.** The
220 configurational frustration index relative to the frustration in the human ACE2-spike complex is
221 shown for (A) mouse (*Mus musculus*) and (B) tiger (*Panthera tigris*) on a contact map
222 illustrating select contacts between the SARS-Cov-2 spike and the ACE2 protein. Corresponding
223 histograms of the frustration index between all contacts between the ACE2 and spike protein are
224 also shown. (A) and (B) are representative examples of animals that are resistant to COVID-19
225 and susceptible to COVID-19, respectively. Animals that resist COVID-19 appear to have
226 frustrated outliers that represent highly unfavorable residue interactions compared to the human
227 ACE2-spike complex (i.e., $\Delta F_{ij}^{(Species)} < -1.5$). For the mouse, a single frustrated interaction
228 between residue 31N of the ACE2 protein and 484E of the spike glycoprotein appears to confer
229 COVID-19 resistance. (C) The frustrated interaction is plotted on the modeled 3D structure of
230 the spike glycoprotein bound to the mouse ACE2 receptor.
231



232

233 **Figure 2.**

234 **Phylogenetic tree representing the evolutionary distance between ACE2 proteins of different**
 235 **species.** The lengths in the radial direction denote the Jukes-Cantor distance (See Materials &
 236 Methods) as a measure of evolutionary distance between any two ACE2 proteins. The
 237 experimental observation of SARS-CoV-2 resistance/susceptibility are plotted alongside the
 238 computational predictions for resistance/susceptibility based on our frustration analysis of the

239 ACE2-spike complex. See the Legend for more details. There is a consistency between the
240 computational predictions and the experimental observations for mouse (*Mus musculus*), chicken
241 (*Gallus gallus domesticus*)(Shi et al., 2020), duck (*Anas platyrhynchos*)(Shi et al., 2020), mink
242 (*Neovison vison*)(Oude Munnink et al., 2021), bat (*Eidolon helvum*)(Kumakamba et al., 2020),
243 Syrian golden hamster (*Mesocricetus auratus*)(Sia et al., 2020), tiger (*Panthera tigris*), white-
244 tailed deer (*Odocoileus virginianus*)(Palmer et al., 2021), European rabbit (*Oryctolagus*
245 *cuniculus*)(Mykytyn et al., 2020), and pig (*Sus scrofa*)(BS et al., 2021). However, apparent
246 inconsistencies are found for ferret (*Mustela putorius furo*)(Shi et al., 2020) and dog (*Canis lupis*
247 *familiaris*) (Shi et al., 2020; Sit et al., 2020)—however, SARS-Cov-2 has only been observed to
248 replicate in the upper respiratory tract of ferrets(Shi et al., 2020), and viral replication has been
249 observed to be low in dogs(Shi et al., 2020).

250

251

252 **Conclusion**

253 The COVID-19 pandemic and the spread of other coronaviruses in recent years requires an
254 indirect approach to understanding the molecular determinants behind susceptibility and
255 resistance. Here, we constructed structural models of the ACE2-spike glycoprotein complex for a
256 wide range of animals with ACE2 receptors. Using an energy landscape theory-based analysis
257 we are able to uncover specific inter-protein interactions between the ACE2 and spike that
258 appear to confer COVID-19 resistance. Our predictions appear to be consistent with many of the
259 experimental observations regarding animal susceptibility, providing a structural explanation to
260 those observations.

261

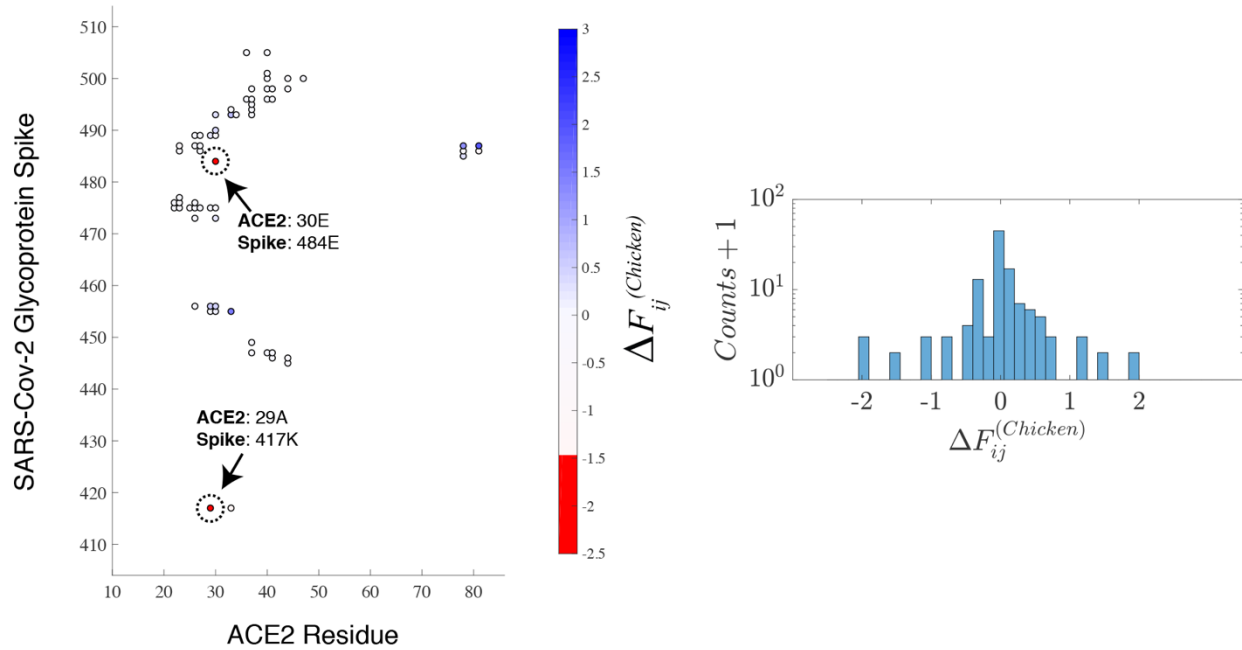
262 Our analysis reveals that the evolutionary distance between ACE2 proteins is not sufficient to
263 predict COVID-19 susceptibility (Figure 2). Rather, an energy landscape-based analysis appears
264 necessary to assess the interactions between the ACE2 protein and the SARS-Cov-2 spike
265 glycoprotein.

266

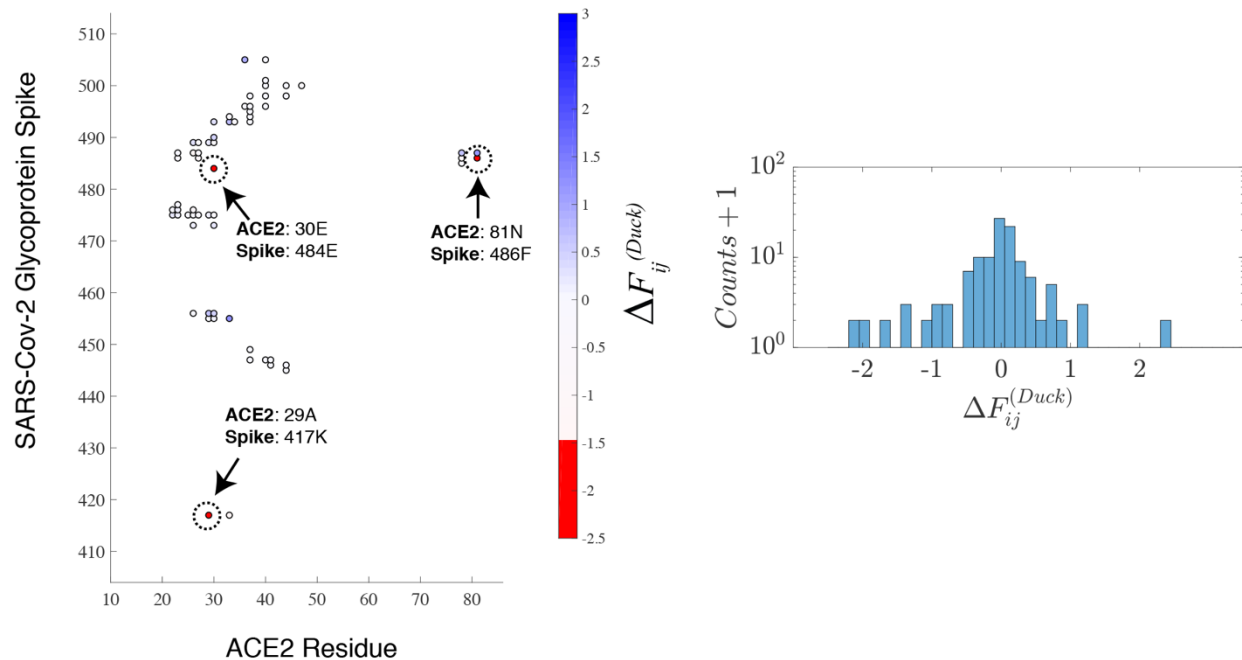
267 **Acknowledgements**

268 The authors would like to thank Matthew MacManes, Erez Aiden, and Olga Dudchenko for
269 helpful discussions and providing data and resources through the DNA Zoo. This work was
270 supported by the Center for Theoretical Biological Physics sponsored by the National Science
271 Foundation NSF Grant PHY-2019745. J.N.O. was also supported by the NSF-CHE-1614101
272 and by the Welch Foundation (Grant C-1792). J.N.O. is a Cancer Prevention and Research
273 Institute of Texas. Scholar in Cancer Research.
274
275

A Chicken ACE2-spike



B Duck ACE2-spike



276
277
278
279

280 **Figure S1. Comparative analysis of the frustration indices with respect to those observed in**
281 **human ACE2-spike complex for additional examples of animals with known COVID-19**

282 **resistance.** The configurational frustration index relative to the frustration in the human ACE2-
283 spike complex is shown for (A) chicken (*Gallus gallus domesticus*) and (B) duck (*Anas*
284 *platyrhynchos*) on a contact map illustrating select contacts between the SARS-Cov-2 spike and
285 the ACE2 protein. Corresponding histograms of the frustration index between all contacts
286 between the ACE2 and spike protein are also shown. Animals that resist COVID-19 appear to
287 have frustrated outliers that represent highly unfavorable residue interactions compared to the
288 human ACE2-spike complex (i.e., $\Delta F_{ij}^{(Species)} < -1.5$). For the chicken, two highly frustrated
289 interactions are identified: between (1) 30E of the ACE2 and 484E of the spike and (2) 29A of
290 the ACE2 and 417K of the spike. For the duck, three highly frustrated interactions are identified:
291 between (1) 30E of the ACE2 and 484E of the spike, (2) 29A of the ACE2 and 417K of the
292 spike, and (3) 81N of the ACE2 and 486F of the spike. These frustrated interactions appear to
293 confer COVID-19 resistance.

294

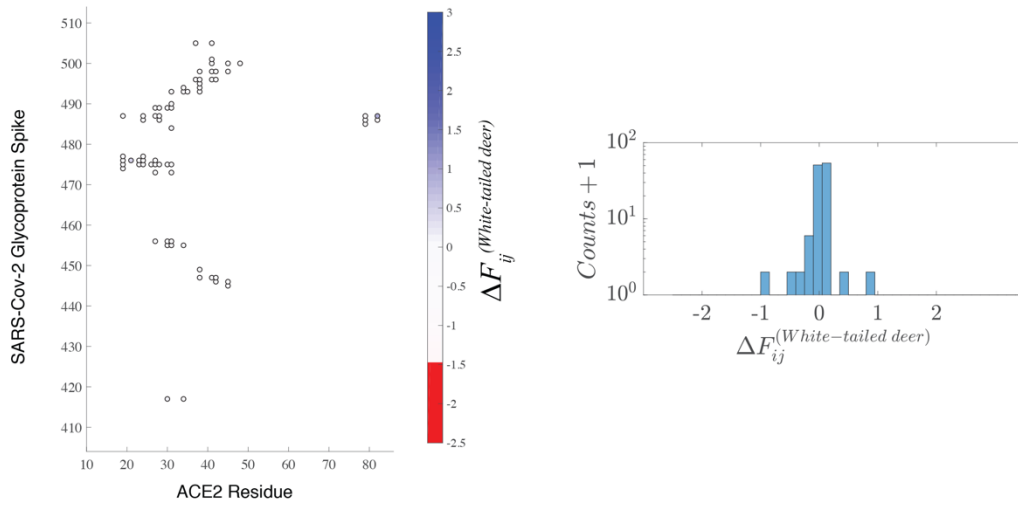
295

296

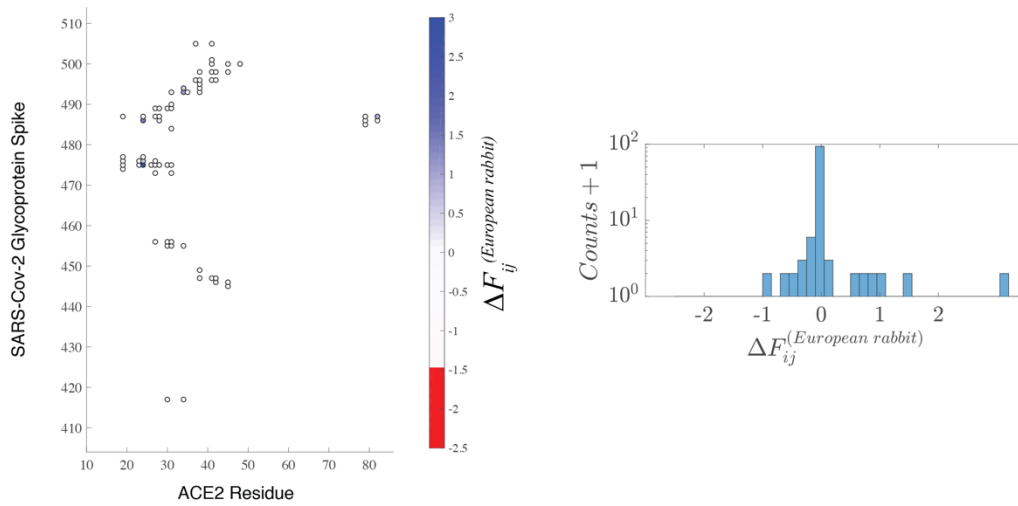
297

298

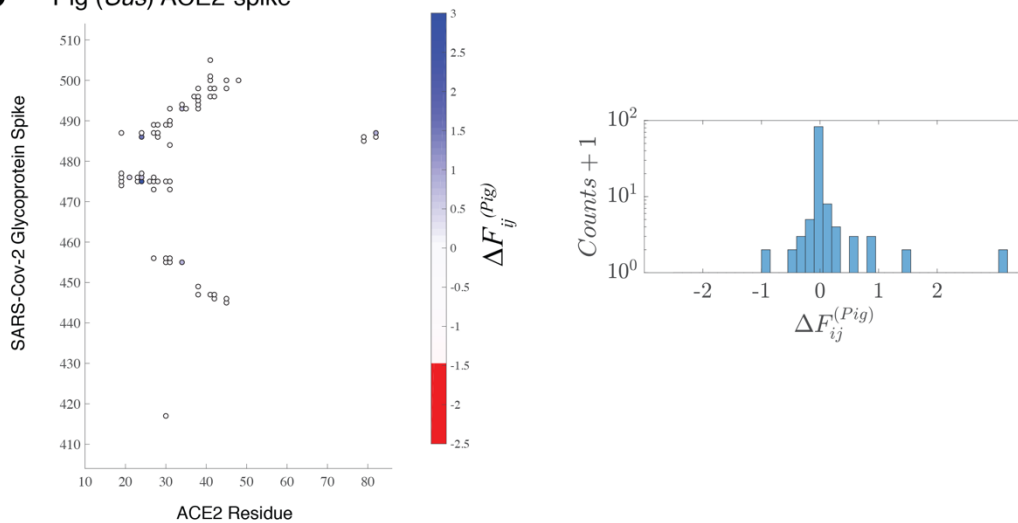
A White-tailed Deer (*Odocoileus virginianus*) ACE2-spike



B European Rabbit (*Oryctolagus cuniculus*) ACE2-spike



C Pig (*Sus*) ACE2-spike



300 **Figure S2. Comparative analysis of the frustration indices with respect to those observed in**
301 **human ACE2-spike complex for additional examples of animals with known COVID-19**
302 **susceptibility.** The configurational frustration index relative to the frustration in the human
303 ACE2-spike complex is shown for (A) white-tailed deer (*Odocoileus virginianus*), (B) European
304 rabbit (*Oryctolagus cuniculus*), and (C) pig (*Sus*) on a contact map illustrating select contacts
305 between the SARS-Cov-2 spike and the ACE2 protein. Corresponding histograms of the
306 frustration index between all contacts between the ACE2 and spike protein are also shown.
307 Animals that are susceptible to COVID-19 appear to have comparable levels of frustration
308 compared to human ACE2-spike complex.

309
310
311
312
313
314

315 Becker, D. J., Albery, G. F., Sjodin, A. R., Poisot, T., Dallas, T. A., Eskew, E. A., . . . Carlson,
316 C. J. (2020). Predicting wildlife hosts of betacoronaviruses for SARS-CoV-2 sampling
317 prioritization: a modeling study. *bioRxiv*, 2020.2005.2022.111344.
318 doi:10.1101/2020.05.22.111344

319 BS, P., G, S., MM, P., C, E.-H., E, M., P, M., & CE, L. (2021). Susceptibility of Domestic Swine
320 to Experimental Infection with Severe Acute Respiratory Syndrome Coronavirus 2.
321 *Emerg Infect Dis.*, 27(1), 104-112. doi:<https://dx.doi.org/10.3201/eid2701.203399>

322 Damas, J., Hughes, G. M., Keough, K. C., Painter, C. A., Persky, N. S., Corbo, M., . . . Lewin,
323 H. A. (2020). Broad host range of SARS-CoV-2 predicted by comparative and structural
324 analysis of ACE2 in vertebrates. *Proceedings of the National Academy of Sciences*,
325 117(36), 22311. doi:10.1073/pnas.2010146117

326 Davtayan, A., Schafer, N. P., Zheng, W., Clementi, C., Wolynes, P. G., & Papoian, G. A. (2012).
327 AWSEM-MD: Protein Structure Prediction Using Coarse-Grained Physical Potentials
328 and Bioinformatically Based Local Structure Biasing. *The Journal of Physical Chemistry*
329 *B*, 116(29), 8494-8503. doi:10.1021/jp212541y

330 Dudchenko, O., Batra, S. S., Omer, A. D., Nyquist, S. K., Hoeger, M., Durand, N. C., . . . Aiden,
331 E. L. (2017). De novo assembly of the Aedes aegypti genome
332 using Hi-C yields chromosome-length scaffolds. *Science*, 356(6333), 92.
333 doi:10.1126/science.aal3327

334 Ferreiro, D. U., Hegler, J. A., Komives, E. A., & Wolynes, P. G. (2007). Localizing frustration in
335 native proteins and protein assemblies. *Proceedings of the National Academy of Sciences*,
336 104(50), 19819. doi:10.1073/pnas.0709915104

337 Frank, H. K., Enard, D., & Boyd, S. D. (2020). Exceptional diversity and selection pressure on
338 SARS-CoV and SARS-CoV-2 host receptor in bats compared to other mammals.
339 *bioRxiv*, 2020.2004.2020.051656. doi:10.1101/2020.04.20.051656

- 340 Gautam, A., Kaphle, K., Shrestha, B., & Phuyal, S. (2020). Susceptibility to SARS, MERS, and
341 COVID-19 from animal health perspective. *Open Vet J*, *10*(2), 164-177.
342 doi:10.4314/ovj.v10i2.6
- 343 Goldstein, J. (2020). Bronx Zoo Tiger Is Sick With the Coronavirus. *New York Times*. Retrieved
344 from <https://www.nytimes.com/2020/04/06/nyregion/bronx-zoo-tiger-coronavirus.html>
- 345 Kumakamba, C., Niama, F. R., Muyembe, F., Mombouli, J.-V., Kingebeni, P. M., Nina, R. A., . . .
346 . Lange, C. E. (2020). Coronavirus surveillance in Congo basin wildlife detects RNA of
347 multiple species circulating in bats and rodents. *bioRxiv*, 2020.2007.2020.211664.
348 doi:10.1101/2020.07.20.211664
- 349 Lam, S. D., Bordin, N., Waman, V. P., Scholes, H. M., Ashford, P., Sen, N., . . . Orengo, C. A.
350 (2020). SARS-CoV-2 spike protein predicted to form complexes with host receptor
351 protein orthologues from a broad range of mammals. *Scientific Reports*, *10*(1), 16471.
352 doi:10.1038/s41598-020-71936-5
- 353 Li, W., Moore, M. J., Vasilieva, N., Sui, J., Wong, S. K., Berne, M. A., . . . Farzan, M. (2003).
354 Angiotensin-converting enzyme 2 is a functional receptor for the SARS coronavirus.
355 *Nature*, *426*(6965), 450-454. doi:10.1038/nature02145
- 356 Luan, J., Lu, Y., Jin, X., & Zhang, L. (2020). Spike protein recognition of mammalian ACE2
357 predicts the host range and an optimized ACE2 for SARS-CoV-2 infection. *Biochemical
358 and Biophysical Research Communications*, *526*(1), 165-169.
359 doi:<https://doi.org/10.1016/j.bbrc.2020.03.047>
- 360 Madeira, F., Park, Y. M., Lee, J., Buso, N., Gur, T., Madhusoodanan, N., . . . Lopez, R. (2019).
361 The EMBL-EBI search and sequence analysis tools APIs in 2019. *Nucleic Acids
362 Research*, *47*(W1), W636-W641. doi:10.1093/nar/gkz268
- 363 Martínez-Hernández, F., Isaak-Delgado, A. B., Alfonso-Toledo, J. A., Muñoz-García, C. I.,
364 Villalobos, G., Aréchiga-Ceballos, N., & Rendón-Franco, E. (2020). Assessing the
365 SARS-CoV-2 threat to wildlife: Potential risk to a broad range of mammals. *Perspectives
366 in Ecology and Conservation*. doi:<https://doi.org/10.1016/j.pecon.2020.09.008>
- 367 Melin, A. D., Janiak, M. C., Marrone, F., Arora, P. S., & Higham, J. P. (2020). Comparative
368 ACE2 variation and primate COVID-19 risk. *Communications Biology*, *3*(1), 641.
369 doi:10.1038/s42003-020-01370-w
- 370 Muñoz-Fontela, C., Dowling, W. E., Funnell, S. G. P., Gsell, P.-S., Riveros-Balta, A. X.,
371 Albrecht, R. A., . . . Barouch, D. H. (2020). Animal models for COVID-19. *Nature*,
372 *586*(7830), 509-515. doi:10.1038/s41586-020-2787-6
- 373 Mykytyn, A. Z., Lamers, M. M., Okba, N. M. A., Breugem, T. I., Schipper, D., van den Doel, P.
374 B., . . . Haagmans, B. L. (2020). Susceptibility of rabbits to SARS-CoV-2. *bioRxiv*,
375 2020.2008.2027.263988. doi:10.1101/2020.08.27.263988
- 376 Onuchic, J. N., Luthey-Schulten, Z., & Wolynes, P. G. (1997). THEORY OF PROTEIN
377 FOLDING: The Energy Landscape Perspective. *Annual Review of Physical Chemistry*,
378 *48*(1), 545-600. doi:10.1146/annurev.physchem.48.1.545
- 379 Onuchic, J. N., & Wolynes, P. G. (2004). Theory of protein folding. *Current Opinion in
380 Structural Biology*, *14*(1), 70-75. doi:<https://doi.org/10.1016/j.sbi.2004.01.009>
- 381 Oude Munnink, B. B., Sikkema, R. S., Nieuwenhuijse, D. F., Molenaar, R. J., Munger, E.,
382 Molenkamp, R., . . . Koopmans, M. P. G. (2021). Transmission of SARS-CoV-2 on mink
383 farms between humans and mink and back to humans. *Science*, *371*(6525), 172.
384 doi:10.1126/science.abe5901

- 385 Palmer, M. V., Martins, M., Falkenberg, S., Buckley, A., Caserta, L. C., Mitchell, P. K., . . . Diel,
386 D. G. (2021). Susceptibility of white-tailed deer (&em>Odocoileus
387 virginianus) to SARS-CoV-2. *bioRxiv*, 2021.2001.2013.426628.
388 doi:10.1101/2021.01.13.426628
- 389 Parra, R. G., Schafer, N. P., Radusky, L. G., Tsai, M.-Y., Guzovsky, A. B., Wolynes, P. G., &
390 Ferreiro, D. U. (2016). Protein Frustratometer 2: a tool to localize energetic frustration in
391 protein molecules, now with electrostatics. *Nucleic Acids Research*, 44(W1), W356-
392 W360. doi:10.1093/nar/gkw304
- 393 Shang, J., Ye, G., Shi, K., Wan, Y., Luo, C., Aihara, H., . . . Li, F. (2020). Structural basis of
394 receptor recognition by SARS-CoV-2. *Nature*, 581(7807), 221-224. doi:10.1038/s41586-
395 020-2179-y
- 396 Shi, J., Wen, Z., Zhong, G., Yang, H., Wang, C., Huang, B., . . . Bu, Z. (2020). Susceptibility of
397 ferrets, cats, dogs, and other domesticated animals to SARS–coronavirus 2. *Science*,
398 368(6494), 1016. doi:10.1126/science.abb7015
- 399 Sia, S. F., Yan, L.-M., Chin, A. W. H., Fung, K., Choy, K.-T., Wong, A. Y. L., . . . Yen, H.-L.
400 (2020). Pathogenesis and transmission of SARS-CoV-2 in golden hamsters. *Nature*,
401 583(7818), 834-838. doi:10.1038/s41586-020-2342-5
- 402 Sit, T. H. C., Brackman, C. J., Ip, S. M., Tam, K. W. S., Law, P. Y. T., To, E. M. W., . . . Peiris,
403 M. (2020). Infection of dogs with SARS-CoV-2. *Nature*, 586(7831), 776-778.
404 doi:10.1038/s41586-020-2334-5
- 405 The UniProt, C. (2021). UniProt: the universal protein knowledgebase in 2021. *Nucleic Acids*
406 *Research*, 49(D1), D480-D489. doi:10.1093/nar/gkaa1100
- 407 Wang, Q., Zhang, Y., Wu, L., Niu, S., Song, C., Zhang, Z., . . . Qi, J. (2020). Structural and
408 Functional Basis of SARS-CoV-2 Entry by Using Human ACE2. *Cell*, 181(4), 894-
409 904.e899. doi:<https://doi.org/10.1016/j.cell.2020.03.045>
- 410 Waterhouse, A., Bertoni, M., Bienert, S., Studer, G., Tauriello, G., Gumienny, R., . . . Schwede,
411 T. (2018). SWISS-MODEL: homology modelling of protein structures and complexes.
412 *Nucleic Acids Research*, 46(W1), W296-W303. doi:10.1093/nar/gky427
- 413 Yan, R., Zhang, Y., Li, Y., Xia, L., Guo, Y., & Zhou, Q. (2020). Structural basis for the
414 recognition of SARS-CoV-2 by full-length human ACE2. *Science*, 367(6485), 1444.
415 doi:10.1126/science.abb2762
- 416 Zhou, P., Yang, X.-L., Wang, X.-G., Hu, B., Zhang, L., Zhang, W., . . . Shi, Z.-L. (2020). A
417 pneumonia outbreak associated with a new coronavirus of probable bat origin. *Nature*,
418 579(7798), 270-273. doi:10.1038/s41586-020-2012-7
- 419