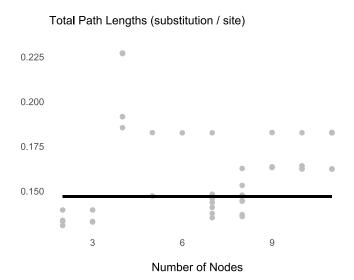
### Has SARS-like Coronaviruses Been Evolving Gradually?

Kevin Surya, Jacob Gardner, and Chris Organ

Having instigated two pandemics so far, how have the broader culprits, SARS-like betacoronaviruses, been evolving? These SARS-like viruses (CoVs) naturally circulate among bats and have periodically jumped to other mammals such as civets, pangolins, and eventually humans [1–3]. Here, we test whether the SARS-like CoV genomes have evolved gradually or in a punctuated manner so that most divergences occurred during transmission events. We further test if the mode of evolution shifted once a pandemic began.

To test for punctuated evolution [4,5], we regressed total phylogenetic path lengths of SARS-like CoV genomes (root-to-tip distances) on the net number of transmission events (nodes). We acquired a molecular tree (Figure A1) of 52 genomes from Nextstrain [6,7]. And we used the maximum likelihood algorithm in BAYESTRAITS 3.0.1 [8], under a phylogenetic generalized least squares (PGLS), to estimate the parameters of the regression above. Punctuation would be consistent with a strong positive correlation. We also compared the fit of this model with two others (Figure A2 and A3), where we allowed the regression lines to vary across strains (SARS-CoV, SARS-CoV-2, and SARS-like CoV).

The most likely model, accounting for complexity, is the one with a single regression fit line (BIC = -510.55; lowest  $\Delta$ BIC = 4.31). Looking at this model (Figure 1), we, however, find little evidence for a punctuated evolution (slope = .0000044 ± .000028, P = .438;  $R^2$  = .0049). Diagnostics indicate violations of linear regression assumptions (Figure A4). And, the node-density artifact [4,9], an underestimation of branch lengths in tree regions with fewer taxa, biases our analysis ( $\delta$  = 9.46; Figure A5). A potential source of bias is that researchers and labs sequence SARS-like CoV genomes more frequently at the onset and during a pandemic. Altogether, while the broader SARS-like betacoronaviruses may have been evolving gradually at all times, this investigation should be interpreted with care.

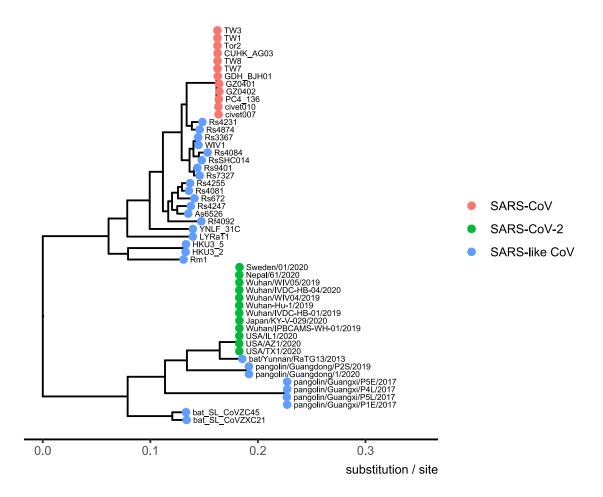


**Figure 1.** The number of nodes along the SARS-like betacoronavirus lineages (net transmission events) does not correlate with, nor does it explain the variation ( $R^2 = .00049$ ) in total path lengths (substitutions in the genome). PGLS equation: y = .15 - .0000044x.

#### References

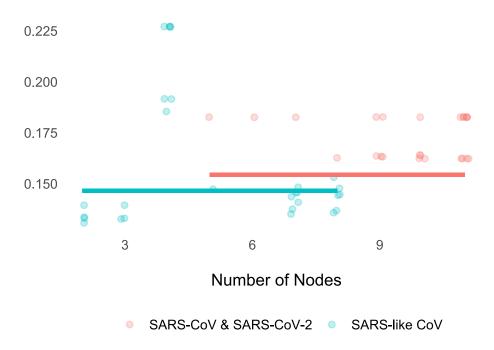
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# **Appendix**



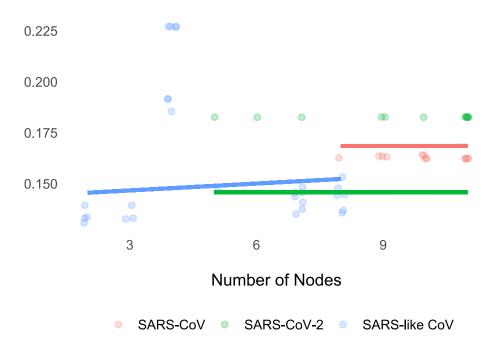
**Figure A1.** Molecular phylogeny of SARS-like betacoronaviruses downloaded from Nextstrain. This tree contains 52 genomes (12 SARS-CoV, 12 SARS-CoV-2, and 28 SARS-like CoV).

#### Total Path Lengths (substitution / site)

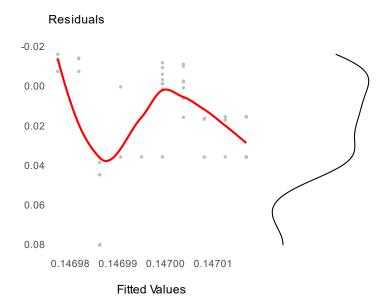


**Figure A2.** SARS-like betacoronaviruses have likely been evolving gradually before and during the two pandemics (slope [SARS-CoV & SARS-CoV-2] = .0000038  $\pm$  .000027, P = .445; slope [SARS-like CoV] = -.0000010  $\pm$  .0012, P = .500;  $R^2$  = .049). Having two regression fit lines, however, do not increase the likelihood enough relative to the model with only one line ( $\Delta$ BIC = -5.32). PGLS Equation (SARS-CoV & SARS-CoV-2): y = .154 + .0000038x. PGLS Equation (SARS-like CoV): y = .147 - .0000010x. The intercepts seem off because they represent phylogenetic means.

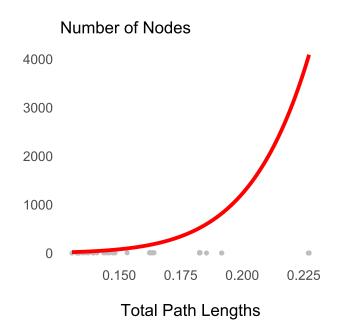
#### Total Path Lengths (substitution / site)



**Figure A3.** SARS-like betacoronaviruses have likely been evolving gradually before and during the two pandemics (slope [SARS-CoV and SARS-CoV-2; fixed to be equal] =  $.0000032 \pm .000026$ , P = .451; slope [SARS-like CoV] =  $0.0011 \pm .0012$ , P = .187;  $R^2 = .14$ ). Having three regression fit lines, however, do not increase the likelihood enough relative to the model with only one line ( $\Delta$ BIC = -4.31). PGLS Equation (SARS-CoV): y = .169 + .0000032x. PGLS Equation (SARS-CoV-2): y = .146 + .0000032x. PGLS Equation (SARS-like CoV): y = .143 + 0.0011x. The intercepts seem off because they represent phylogenetic means.

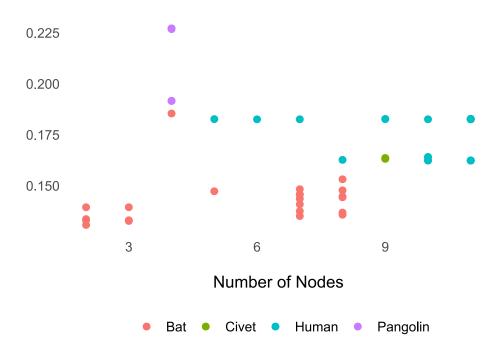


**Figure A4.** Regression diagnostics indicate assumption violations. The residuals vs. fitted values plot shows that residuals are not constant across the fitted values. Also, the distribution of the residuals is right-skewed.



**Figure A5.** The node-density artifact is clearly present ( $\delta$  = 9.46). (A symptom of the artifact is a curvilinear relationship with  $\delta$  > 1.) Equation: y = 5,039,309,975x<sup>9.46</sup>.

## Total Path Lengths (substitution / site)



**Figure A6.** SARS-like betacoronaviruses seem to have been evolving gradually, at least in bats and humans, where we have a decent sample size.