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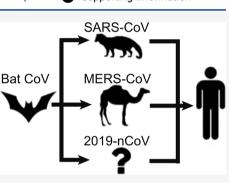
Communication

Protein Structure and Sequence Reanalysis of 2019-nCoV Genome Refutes Snakes as Its Intermediate Host and the Unique Similarity between Its Spike Protein Insertions and HIV-1

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ABSTRACT: As t	the infection of 2019-nCoV c	ronavirus is quickly developing into	SARS-CoV

a global pneumonia epidemic, the careful analysis of its transmission and cellular mechanisms is sorely needed. In this Communication, we first analyzed two recent studies that concluded that snakes are the intermediate hosts of 2019-nCoV and that the 2019-nCoV spike protein insertions share a unique similarity to HIV-1. However, the reimplementation of the analyses, built on larger scale data sets using state-of-the-art bioinformatics methods and databases, presents clear evidence that rebuts these conclusions. Next, using metagenomic samples from *Manis javanica*, we assembled a draft genome of the 2019-nCoV-like coronavirus, which shows 73% coverage and 91% sequence identity to the 2019-nCoV genome. In particular, the alignments of the spike surface glycoprotein receptor binding domain revealed four times more variations in the bat coronavirus RaTG13 than in the *Manis* coronavirus compared



with 2019-nCoV, suggesting the pangolin as a missing link in the transmission of 2019-nCoV from bats to human.

KEYWORDS: 2019-nCoV, metagenome assembly, Malayan pangolins, spike protein

INTRODUCTION

The 2019 novel coronavirus (2019-nCoV), also known as SARS-CoV- 2^{1} and HCoV-19,² is the pathogen behind COVID-19, a new type of pneumonia that initially caused an outbreak in Wuhan, China and has since spread to most countries in the world. The rapid transmission across country borders and the large number of confirmed cases prompted the World Health Organization (WHO) to declare COVID-19 as a global pandemic on March 11, 2020. As of March 23, there are at least 332 930 and 14 510 patients who have been diagnosed with and have died of COVID-19 worldwide, respectively. Among the affected countries, China has the largest population of confirmed cases (81 610) and the second highest death toll (3276). Meanwhile, Europe and North America have also been hit hard: 59 138 and 31 573 cases were confirmed in Italy and the United States, which are the nations with the highest number of 2019-nCoV infected patients in their respective continents, with the number of deaths in Italy (5476) surpassing that of China. Understanding the viral infection mechanisms and animal hosts is of high urgency for the control and treatment of the 2019-nCoV virus. Whereas it is now commonly recognized that bats such as Rhinolophus affinis may serve as the natural reservoir of 2019-nCoV,³ it is still unclear which animal served as the intermediate host that brought the bat coronavirus to human hosts. Whereas multiple studies suggest the Malayan pangolin (Manis javanica) as another host, $^{4-6}$ some studies have proposed that the pangolin may be a natural host rather than an intermediate host.

During 2019-nCoV's infection of host cells, a critical virion component is the spike surface glycoprotein, also known as the S protein. Spike proteins constitute the outermost component in a coronavirus virion particle and are responsible for the recognition of angiotensin-converting enzyme 2 (ACE2), a transmembrane receptor on mammalian hosts that is utilized by the coronavirus to enter the host cells.^{3,9} Therefore, the spike protein largely determines the host specificity and infectivity of a coronavirus.

In this Communication, we first analyzed the results of two recent studies,^{10,11} which have spurred numerous interests and discussions in the community and society regarding the sequence and structure of the spike protein in 2019-nCoV and the identification of its intermediate hosts. In particular, the study by Pradhan et al. reported the identification of four unique insertions that were shared only with HIV-1 and were "unlikely to be fortuitous in nature".¹⁰ Although the work has been questioned by the scientific community, rumors and conspiracy theories based on these studies still widely circulate among the general public.¹² We therefore believe that there is an urgent

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2 QHD43416 MFVFLVLLPL VSSQCVNLTT RTQLPPAY TNSFTRGV YYPDKVFRSS VLHSTQDLFL PFFSNVTWFH AIHVSGTNGT KRFDNPVLPF NDGVYFASTE KSNIIKGWIF P59594 MFIFLLFLTL TSGSDLDRCT TFDDVQAPNY TQHTSSMRGV YYPDEIFRSD TLYLTQDLFL PFYSNVTGFH TINHTFGNPVIPF KDGIYFAATE KSNVVRGWVF
111 QHD43416 GTTLDSKTOS LLIVNNATNY VIKVCEFQFC NDFFLGWYH KNNKSWMESE FRVYSSANNC TFEYVSQPFL MDLEGKQGNF KNLREFVFKN IDGYFKIYSK HTPINLVRDL P59594 GSTMINKSOS VIIINNSTNV VIRACNFELC DNPFFAV···· - SKPMGTOTH TMIFDNAFNC TFEYISDAFS LDVSEKSGNF KHLREFVFKN KDGPLYVYKG VQPIDVVRDL
221 QHD43416 PGGFSALEPL VDLPIGINIT RFOTLLALHE SYLTHGDSSS GWTAGAAAYY VGYLOPRTFL LKYNENGTIT DAVDCALDPL SETKCTLKSF EVEKGIYQTS NFRVOPTEST P59594 PSGFNTLKPI FKLPLGINIT NFRALLT AFSPADIWGTSAAAYF VGYLKPTTFM LKYDENGTIT DAVDCSONPL AELKCSVKSF EIDKGIYQTS NFRVVPSGDV
331 QHD43416 P59594 VRFPNITNLC PFGEVFNATE FASVYAWNEE RISNCVADYS VLYNSASFST FECYGVSPTE LNDLCFTNVY ADSFVIEGDE VRQIAPGQTG MIADYNYELP DDFTGCVIAW VRFPNITNLC PFGEVFNATE FPSVYAWEEE RISNCVADYS VLYNSTFFST FECYGVSATE LNDLCFSNVY ADSFVEGDD VRQIAPGQTG VIADYNYELP DDFTGCVIAW
441 QHD43416 NSNNLDSKVG GNYNYLYRLF RKSNLKPFER DISTEIYQAG STPCNGVEGF NCYFPLQSYG FQPTNGVGYQ PYRVVVLSFE LLHAPATVCG PKKSTNLVKN KCVNFNFNGL P59594 NTRNIDATST GNYNYKYRYL RHGKLRPFER DISNVPFSPD GKPCTP-PAL NCYWPLNDYG FYTTGIGYQ PYRVVVLSFE LLNAPATVCG PKLSTDLIKN OCVNFNFNGL
551 QHD43416 TGTGVLTESN KKFLPFQQFG RDIADTTDAV RDPQTLEILD ITPCSFGGVS VITPGTNTSN QVAVLYQDVN CTEVPVAIHA DQLTPTWRVY STGSNVFQTR AGCLIGAEHV P59594 TGTGVLTPSS KRFQPFQQFG RDVSDFTDSV RDPKTSEILD ISPCSFGGVS VITPGTNASS EVAVLYQDVN CTDVSTAIHA DQLTPAWRIY STGSNVFQTR AGCLIGAEHV
661 QHD43416 NNSYECDIPI GAGICASYOT QTNSPREARS VASOSIIAYT MSLGAENSVA YSNNSIAIPT NFTISVTTEI LPVSMTKTSV DCTMYICGDS TECSNLLLQY GSFCTOLNEA P59594 DTSYECDIPI GAGICASYHT VSLLRS TSOKSIVAYT MSLGADSSIA YSNNTIAIPT NFSISITTEV MPVSMAKTSV DCNMYICGDS TECANLLLQY GSFCTOLNEA
771 QHD43416 LTGIAVEQDK NTQEVFAQVK QIYKTPPIKD FGGFNFSQIL PDPSKPSKRS FIEDLLFNKV TLADAGFIKQ YGDCLGDIAA RDLICAQKFN GLTVLPPLLT DEMIAQYTSA P59594 LSGIAAEQDR NTREVFAQVK QMYKTPTLKY FGGFNFSQIL PDPLKPTKRS FIEDLLFNKV TLADAGFMKQ YGECLGDINA RDLICAQKFN GLTVLPPLLT DDMIAAYTAA
881 QHD43416 LLAGTITSGW TFGAGAALQI PFAMQMAYRF NGIGVTONVL YENQKLIANQ FNSAIGKIQD SLSSTASALG KLQDVVNQNA QALNTLVKOL SSNFGAISSV LNDILSRLDK P59594 LVSGRATAGW TFGAGAALQI PFAMQMAYRF NGIGVTONVL YENQKQIANQ FNKAISOIQE SLTTSTALG KLQDVVNQNA QALNTLVKOL SSNFGAISSV LNDILSRLDK
991 QHD43416 VEAEVQIDRL ITGRLQSLQT YVTQQLIRAA EIRASANLAA TKMSECVLGQ SKRVDFCGKG YHLMSFPQSA PHGVVFLHVT YVPAQEKNFT TAPAICHDGK AHFPREGVFV P59594 VEAEVQIDRL ITGRLQSLQT YVTQQLIRAA EIRASANLAA TKMSECVLGQ SKRVDFCGKG YHLMSFPQAA PHGVVFLHVT YVPAQEKNFT TAPAICHGK AYFPREGVFV
1101 QHD43416 SNGTHWFVTQ ENFYEPQIIT TDNTFVSGNC DVVIGIVNNT VYDPLQPELD SFEELDEYF KNHTSPDVDL GDISGINASV VNIQEEIDEL NEVAKNLNES LIDLQELGEY P59594 FNGTSWFITQ ENFFSPQIIT TDNTFVSGNC DVVIGIINNT VYDPLQPELD SFEELDEYF KNHTSPDVDL GDISGINASV VNIQEEIDEL NEVAKNLNES LIDLQELGEY
1211 QHD43416 EQYIKWPWYI WLGFIAGLIA IVMVTIMLCC MTSCCSCLKG CCSCGSCCKF DEDDSEPVLK GVKLHYT P59594 EQYIKWPWYV WLGFIAGLIA IVMVTILLCC MTSCCSCLKG ACSCGSCCKF DEDDSEPVLK GVKLHYT

Figure 1. Sequence alignment of spike proteins from 2019-nCoV (NCBI accession: QHD43416) and SARS-CoV (UniProt ID: P59594). The four "novel" insertions "GTNGTKR" (IS1), "YYHKNNKS" (IS2), "GDSSSG" (IS3), and "QTNSPRRA" (IS4) by Pradhan et al. are highlighted by dashed rectangles. We noted that these fragments are not *bona fide* "insertions"; in fact, at least three out of the four fragments are also shared with bat coronavirus RaTG13 spike glycoprotein (NCBI accession: QHR63300.1), as shown in Table 1. Nevertheless, we still refer to these fragments as "insertions" in this Communication for consistency with the original report. The receptor binding domain of the spike is marked by the solid box, which corresponds to residue positions 323–545 in the above alignment. A pair of arrows immediately following IS4 indicates the protease cleavage site by which spike proteins are cut into S1 and S2 isoforms.

need to systematically examine the bases and conclusions of these studies in serious scientific reports. To further examine the animal hosts of the 2019-nCoV spread, we next assembled the draft genome of a highly related coronavirus using metagenomic samples from *Manis javanica*. The alignment results of the assembled genome sequences, in particular, on the spike proteins, suggest the importance of pangolins in the evolution of 2019-nCoV and its transmission from bats to humans.

MATERIALS AND METHODS

Protein Sequence Alignment

Global protein sequence alignment of the full-length coronavirus spike proteins was performed by MUSCLE¹³ and visualized by SeaView.¹⁴

Structure Prediction of Spike-ACE2 Complex

We used C-I-TASSER¹⁵ to create structural models of the fulllength spike protein. Here C-I-TASSER is an extended pipeline of I-TASSER¹⁶ and utilizes the deep convolutional neuralnetwork-based contact maps¹⁷ to guide the Monte Carlo fragment assembly simulations. Because the RBD domain of the spike exhibits different conformations relative to the remaining portion of the protein, the DEMO pipeline¹⁸ was then used to reassemble the domains and to construct a complex structure consisting of the spike trimer and the extracellular domain of human ACE2 using the ACE2-bound conformation 2 of the SARS-CoV spike glycoprotein (PDB ID: 6ACJ) as a template. Our complex modeling did not use the template originally used in the Pradhan et al. study (PDB ID: 6ACD) because it did not include the ACE2 receptor.

Relative Synonymous Codon Usage Analysis

As per the previous study,¹¹ the relative synonymous codon usage (RSCU) for codon j in a species is calculated as

$$X_j = p_j \cdot k_j \tag{1}$$

where k_j is the number of codons synonymous to codon j (including j itself) and p_j is the probability of the respective amino acid being encoded by codon j among all k_j synonymous codons in the protein coding sequences (CDSs) of the whole genome. The difference in codon usage in two different species (a virus versus a vertebrate in our case) is defined by the squared Euclidean distance of RSCU, that is

$$d = \sum_{j=1}^{N} (X_j - X_j')^2$$
(2)

Here N = 61 is the number of codons that encodes amino acids, thereby excluding the three stop codons. X_j and X'_j are the RSCUs for codon j in the virus and in the vertebrate, respectively. In our report, the codon usages of all vertebrates are taken from the CoCoPUTS¹⁹ database, which was last updated in January 2020. This database was therefore much more recent than the Codon Usage Database,²⁰ which was last

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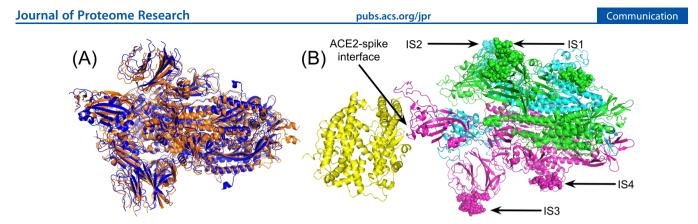


Figure 2. Structure of the 2019-nCoV spike protein trimer. (A) Superposition between the C-I-TASSER constructed model (blue) and the experimental structure (orange, PDB ID: 6VSB), which was determined after our model was predicted. Only residues common to both structures are shown. (B) Complex structure model between human ACE2 (left yellow) and the spike protein trimer (right, with three chains colored in magenta, cyan, and blue, respectively) constructed by C-I-TASSER. The four insertions are shown as spheres. During different stages of coronavirus infection, the spike proteins may be postprocessed (i.e., cleaved) to produce different isoforms. Therefore, the eventual spike complex might not include all residues of a full-length spike protein. Nevertheless, we construct the complex model using a full-length spike sequence to illustrate the locations of the four insertions.

Table 1. BLAST Search Result for IS1^a

IS	NCBI accession	sequence	E value	sequence identity	species
IS1	query	GTNGTKR	27	1.00	2019-nCoV
	APC94153	GTNGTKR	28	1.00	uncultured marine virus
	AFU28737	-TNGTKR	224	0.86	human immunodeficiency virus 1
	AVE17137	GTDGTKR	224	0.86	rat astrovirus Rn/S510/Guangzhou
	QBX18329	-TNGTKR	224	0.86	Streptococcus phage Javan411
	QHR63300	GTNGIKR	643	0.86	bat coronavirus RaTG13
IS2	query	YYHKNNKS	0.13	1.00	2019-nCoV
	QHR63300	YYHKNNKS	0.13	1.00	bat coronavirus RaTG13
	AUL79732	-YHKNNKS	4.2	0.88	tupanvirus deep ocean
	YP_007007173	YYHKDNK-	8.7	0.75	<i>Klebsiella</i> phage vB_KleM_RaK2
	ALS03575	YYHKNN	12	0.75	gokushovirus WZ-2015a
IS3	query	GDSSSG	1004	1.00	2019-nCoV
	QAU19544	GDSSSG	1003	1.00	orthohepevirus C
	AYV78550	GDSSSG	1004	1.00	edafosvirus sp.
	QHR63300	GDSSSG	1004	1.00	bat coronavirus RaTG13
	QDP55596	GDSSSG	1004	1.00	prokaryotic dsDNA virus sp.
IS4	query	QTNSPRRA	1.0	1.00	2019-nCoV
	YP_009226728	QTNSPRR-	8.5	0.88	Staphylococcus phage SPbeta-like
	BAF95810	QTNSPRRA	35	1.00	Bovine papillomavirus type 9
	ARV85991	ETNSPRR-	106	0.75	peach-associated luteovirus
	QDH92312	QTNAPRKA	142	0.75	Gordonia phage Spooky

"If there are multiple redundant hits for the same gene from different strains of the same species removed, then only one hit is shown. The sequence identity is calculated as the number of identical residues divided by the query length. Only the sequence portion aligned to the query is shown. In this table, we also list the closest BLAST hit from bat coronavirus RaTG13, which is known to be closely related to 2019-nCoV.³.

updated in 2007, that was used in the previous research.¹¹ To obtain the codon usage of coronaviruses, we imported the GenBank annotations of the three coronavirus genomes to SnapGene (GSL Biotech) to export the codon usage table based on GenBank annotations. Codon W^{21} was not used for the codon usage calculation as in the previous study because it cannot account for the -1 frameshift translation of the first open reading frame (ORF) in the coronavirus genome.

RESULTS AND DISCUSSION

2019-nCoV Spike Protein Does Not Include Insertions Unique to HIV-1

In a recent manuscript entitled "Uncanny Similarity of Unique Inserts in the 2019-nCoV Spike Protein to HIV-1 gp120 and Gag",¹⁰ Pradhan et al. presented a discovery of four novel insertions unique to 2019-nCoV spike protein (Figure 1). They further concluded that these four insertions are part of the receptor binding site of 2019-nCoV and that these insertions shared "uncanny similarity" to human immunodeficiency virus 1 (HIV-1) proteins but not to other coronaviruses. These claims resulted in considerable public panic and controversy in the community,¹² even after the manuscript was withdrawn. To investigate whether the conclusions by Pradhan et al. are scientifically precise, we reanalyzed the structural location and sequence homology of the four spike protein insertions discussed therein.

Because the full-length structure of the spike protein in 2019nCoV was not available at the beginning of this study, we used C-I-TASSER¹⁵ to model its tertiary structure as part of our

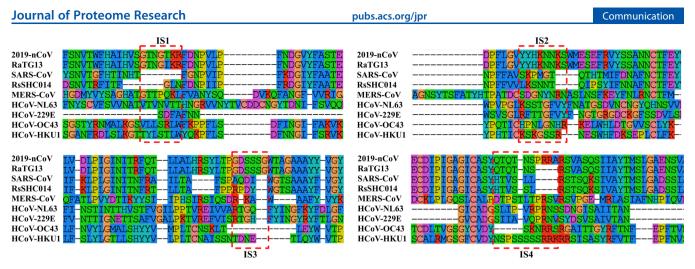


Figure 3. Multiple sequence alignment for the spike proteins of seven known human coronaviruses. 2019-nCoV (QHD43416.1), SARS-CoV (P59594), MERS-CoV (YP_009047204.1), HCoV-NL63 (YP_003767.1), HCoV-229E (NP_073551.1), HCoV-OC43 (YP_009555241.1), and HCoV-HKU1 (YP_173238.1) sequences are downloaded from the NCBI and UniProt databases. RaTG13 (QHR63300.1) and RsSHC014 (AGZ48806.1), the two bat coronaviruses thought to be the ancestors of 2019-nCoV and SARS-CoV, are also included. For brevity, only the regions near the four "insertions" are displayed in the figure.

efforts in the full genome structure and function analyses of 2019-nCoV, which are available at https://zhanglab.ccmb.med. umich.edu/C-I-TASSER/2019-nCoV/. The 2019-nCoV spike model was then assembled with the human ACE2 structure (PDB ID: 6ACJ)²² by DEMO¹⁸ to form a spike-ACE2 complex. In Figure 2A, we present a cartoon superposition of the C-I-TASSER model with a recently solved spike structure,²³ where the C-I-TASSER model shares a high structure similarity, with a TM score of 0.95,^{24,25} to the cryo-EM structure. Because the experimental structure covers only 75% of the residues in the full-length sequence, with several important residues on the receptor binding domain (RBD) of the spike protein missing, our following analysis will mainly be built on the C-I-TASSER reconstructed full-length model. We note that C-I-TASSER, also known as "Zhang-Server", is the top ranked automated server for protein structure prediction in the Critical Assessment of protein Structure Prediction round 13 (CASP13) challenge (http://www.predictioncenter.org/casp13/zscores final. cgi?model_type=best&gr_type=server_only) among all 39 servers from the community. C-I-TASSER improves our previously developed I-TASSER structure prediction protocol²⁶ by incorporating a deep-learning-based contact map prediction.^{17,27} On all 121 CASP13 targets, the average TM score of the C-I-TASSER first model (0.674) is 8.0% higher than that of I-TASSER (0.624) and 0.15% higher than that of C-QUARK (0.673), which is our only other automated CASP13 server and was ranked in second place in CASP13.

As shown in Figure 2B, all four insertions in the C-I-TASSER/ DEMO structural models are located outside the RBD of the spike protein, in contrast with the original conclusion made by Pradhan et al., which stated that the insertions are located on the interface with ACE2. Here it is important to note that following ACE2 receptor binding, the spike protein can be cleaved by host proteases such as cathepsin L (CTSL) to produce the S1 and S2 isoforms to facilitate viral entry into host cells.^{28,29} Because this cutting site immediately follows insertion 4 (IS4) (Figure 1 arrow) along the 2019-nCoV spike protein sequence, there is a possibility that IS4 could affect the cleavage of the spike protein. Regardless, all of the insertions are not directly related to receptor binding.

To investigate the viral homologues of the four insertions, we further performed a BLAST sequence search of these four insertions against the nonredundant (NR) sequence database, restricting the search results to viruses (taxid: 10239) but leaving other search parameters at default values. The top five sequence homologues (including the query itself) identified for each insertion are listed in Table 1. In contrast wit the previous claim that the four insertions are unique to 2019-nCoV and HIV-1, all four insertion fragments can be found in other viruses. In fact, an HIV-1 protein is among the top BLAST hits for only one of the four insertion fragments, whereas three of the four insertion fragments are found in bat coronavirus RaTG13. Moreover, partially due to the very short length of these insertions, which range from six to eight amino acids, the *E* values of the BLAST hits, which is a parameter used by BLAST to assess the statistical significance of the alignments and usually needs to be <0.01 to be considered significant,³⁰ are all >4, except for a bat coronavirus hit for IS2. These high E values suggest that the majority of these similarities are likely to be coincidental.

Given that three out of the four insertion fragments are found in the bat coronavirus RaTG13, it is tempting to assume that these "insertions" may be directly inherited from bat coronaviruses. Currently, there are at least seven known human coronaviruses (2019-nCoV, SARS-CoV, MERS-CoV, HCoV-229E, HCoV-OC43, HCoV-NL63, and HCoV-HKU1), where many of them, including severe acute respiratory syndrome-related coronavirus (SARS-CoV) and Middle East respiratory syndrome-related coronavirus (MERS-CoV), were shown to be transmitted from bats.^{3,31-34} To further examine the evolutionary relationship between the 2019-nCoV and the bat coronavirus in comparison with other human coronaviruses, we used MUSCLE to create a multiple sequence alignment (MSA), presented in Figure 3, for all seven human coronaviruses and two bat coronaviruses, RaTG13 and RsSHC014, which have been considered to be the ancestors of 2019-nCoV and SARS-CoV, respectively.^{3,31,34} Among the four "insertions" (ISs) of the 2019-nCoV, IS1 has only one residue different from the bat coronavirus, and three out of seven residues are identical to MERS-CoV. IS2 and IS3 are both identical to the bat coronavirus. For IS4, although the local sequence alignment by BLAST did not hit the bat coronavirus in Table 1, it has a

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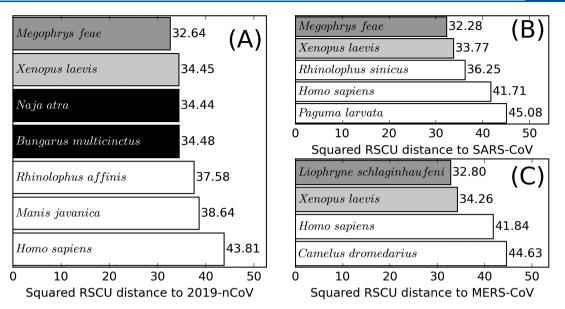


Figure 4. Inability of RSCU analysis for coronavirus host identification for (A) 2019-nCoV, (B) SARS-CoV, and (C) MERS-CoV. The vertebrate species (frogs) with the lowest squared Euclidean distances of RSCU (x axis) to the coronavirus is colored in dark gray, whereas the vertebrate (frog) with the lowest RSCU distance and sufficient statistics is colored in light gray. The snakes proposed by Ji et al. as intermediate hosts (*Naja atra* and *Bungarus multicinctus* snakes) are colored in black. Confirmed hosts (*Rhinolopus affinis* and *Manis javanica* for 2019-nCoV, *Rhinolopus sinicus* and *Paguma larvata* for SARS-CoV, and *Camelus dromedarius* for MERS-CoV, as well as *Homo sapiens* for all three coronaviruses) are colored in white. These data show not only that snakes are not the vertebrates with the lowest RSCU distances to 2019-nCoV but also that unrelated species such as frogs and snakes have smaller RSCU distances to known hosts of all three coronaviruses. These data suggest that the closeness of RSCU is not indicative of a potential pathogen—host relation.

close evolutionary relation to the bat coronavirus in the MSA. In particular, the first six residues in the IS4 fragment "QTQTNS-PRRA" from 2019-nCoV are identical to RaTG13, whereas the last four residues, which were absent in the bat coronavirus or SARS-CoV, have at least 50% identity to MERS-CoV and HCoV-HKU1.

Putting these together, we believe that there is a close evolutionary relation between 2019-nCoV and bat coronavirus RaTG13. The four insertions highlighted by Pradhan et al. in the spike protein are not unique to 2019-nCoV and HIV-1. In fact, the similarities in the sequence-based alignments built on these very short fragments are statistically insignificant, as assessed by the BLAST E values, and such similarities are shared in many other viruses, including the bat coronavirus. Structurally, these "insertions" are far away from the binding interface of the spike protein with the ACE2 receptor, as shown in Figure 2, which is also contradictory to the conclusion made by Pradhan et al.

Relative Synonymous Codon Usage Cannot Identify Intermediate Hosts of Coronaviruses

Another early study attempting to understand the infection of 2019-nCoV was performed by Ji et al.¹¹ In this study, the authors analyzed the RSCU of 2019-nCoV and eight vertebrates, including two species of snakes (*Bungarus multicinctus* and *Naja atra*), hedgehog (*Erinaceus europaeus*), bat (*Rhinolophus sinicus*), marmot (*Marmota*), pangolin (*Manis javanica*), chicken (*Gallus gallus*), and human (*Homo sapiens*). Among these vertebrates, snakes have the smallest codon usage difference (squared Euclidean distance of RSCU) from 2019-nCoV and were therefore proposed by Ji et al. as the intermediate hosts of 2019-nCoV.

This conclusion is, however, controversial among virologists due to the lack of prior biological evidence that zoonotic coronavirus can infect animals other than mammals and birds.³⁵ Moreover, recent studies showed preliminary evidence that pangolins are the likely hosts of 2019-nCoV-like coronaviruses,^{4–6} further invalidating Ji et al.'s conclusion. Whereas the conclusion of snakes being intermediate hosts has been commonly questioned by the scientific community, it is still important to carefully examine the base and reliability of the RSCU approach, which should help prevent such biased analyses from misleading the community and the general public. In this Communication, we scrutinize the bioinformatics approach and the underlying biological assumptions through a large-scale replication of the RSCU analysis.

The bioinformatics analysis performed in the Ji et al. study has several limitations. First, there are only ~300 CDSs in the NCBI GenBank for the snake species (Bungarus multicinctus and Naja atra), which the authors chose for their analysis. These CDSs represent <2% of all protein coding genes in a typical snake genome; the genome of the king cobra (Naja hannah), for example, encodes 18387 proteins according to UniProt (https://www.uniprot.org/proteomes/UP000018936). The limited numbers of known CDSs in Bungarus multicinctus and Naja atra mean that the RSCU statistics may not reflect the actual RSCU distribution in the whole genome. Second, the Codon Usage Database²⁰ used in the analysis of Ji et al. has not been updated since 2007; a reanalysis using a more recent codon usage database such as CoCoPUTs¹⁹ is therefore needed. Third, only 8 vertebrates were analyzed in their study, whereas there are >100 000 vertebrates with at least one CDS in the NCBI GenBank database. Finally, there is no established evidence that viruses evolve their codon usage to resemble that of their animal hosts;³⁶ this calls for a careful benchmark of RSCU analysis in terms of its ability to rediscover known hosts of characterized viruses.

To address these issues, we reimplemented the RSCU comparison algorithm proposed by Ji et al. to analyze the codon usage in the 2019-nCoV genome (NCBI accession

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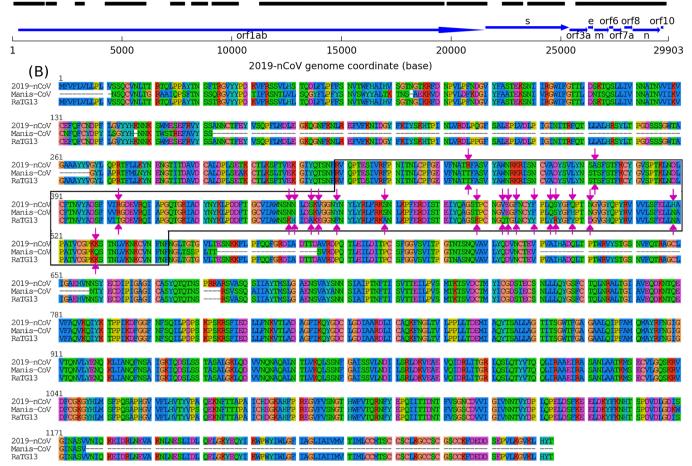


Figure 5. Alignment between 2019-nCoV and the coronavirus infecting *Manis javanica* lung (*Manis*-CoV). (A) Schematic of the alignment between the 2019-nCoV full genome (thin black line) and the draft genome of Manis-CoV, where thick black lines are aligned regions. Protein coding genes are indicated by thick arrows. (B) MSA of spike proteins (marked by "s" in panel A) from 2019-nCoV, bat coronavirus RaTG13, and *Manis*-CoV. Because only 78% of the spike Manis-CoV sequence can be assembled, it contains several gaps in this MSA. Nevertheless, the sequence of the spike RBD domain (solid box) can be fully assembled, where 20 residue positions (marked by arrow pairs) are different between 2019-nCoV and the other two related coronaviruses.

MN908947.3) and those of all 102 367 vertebrate species in the CoCoPUTS database. To test whether this kind of analysis can recover known hosts of well-studied coronaviruses, SARS-CoV (NCBI accession NC_004718) and MERS-CoV (NCBI accession NC_019843) were also included. The codon usage frequency is converted to the squared Euclidean distance of RSCU in two separate analyses: one based on all vertebrates (Supplementary Figure S1A–C) and the other based on the subset of vertebrates with enough statistics, that is, >2000 known CDSs (Supplementary Figure S1D–F), roughly corresponding to 10% of all protein coding genes in a typical vertebrate genome.

As shown in Figure 4A, snakes are not the vertebrates with the lowest RSCU distances to 2019-nCoV, suggesting that the implementation of RSCU analysis by Ji et al. was incomplete. More importantly, the data in Figure 4 show that animals unrelated to coronavirus transmission, such as frogs and snakes, consistently have smaller RSCU distances to known hosts of all three coronaviruses. For example, the top-ranking vertebrates with the lowest RSCU distances to the three different coronaviruses are two kinds of frogs (*Megophrys feae* and *Liophryne schlaginhaufeni*), whereas another frog (*Xenopus laevis*) has the smallest RSCU distances among all vertebrates

with sufficient sequences. Part of the reason for the failure of RSCU in intermediate host identification, as shown in Supplementary Table S1, is that different coronaviruses, such as SARS-CoV and MERS-CoV, that are known to utilize different intermediate hosts (*Paguma larvata* and *Camelus dromedarius*, respectively), have almost no difference in RSCU (squared RSCU distance = 0.12). These data suggest that the RSCU analysis on its own is not specific enough to discriminate coronaviruses from different vertebrate hosts. In this regard, the failure is not merely due to the use of outdated databases or the small number of species included in the original analysis but is, in fact, caused by the incorrect biological assumption that coronaviruses will evolve their RSCU to resemble that of their hosts.

Metagenome Assembly Suggests Pangolins as Potential Hosts of 2019-nCoV

In a recent study,⁶ Xiao et al. first identified coronavirus sequences in pangolins that are highly similar to 2019-nCoV. In addition, three independent groups also reported the identification of 2019-nCoV-like coronaviruses sequences from metagenomics samples taken from the Malayan pangolin (*Manis javanica*),^{4,5,7} making the pangolin a likely intermediate host of the 2019-nCoV.

To further examine the possibility, we tried to reassemble a draft genome sequence of the coronavirus using the metagenomic samples of Manis javanica. To this end, we first collected a set of all publicly available metagenome samples for pangolin, including 11 samples from lung, 8 samples from spleen, 2 samples from lymph (NCBI accession PRJNA573298),³⁷ and 4 samples from feces (NCBI accession PRJNA476660),³⁸ from the NCBI Sequence Read Archive (SRA) database³⁹ using the prefetch command of SRA Toolkit version 2.10.3. These samples were converted to paired-end sequencing reads in FASTQ format by faster-dump. A quality check by FastQC version 0.11.9 showed that whereas the 4 samples from PRJNA476660 do not contain adaptor sequences, all 21 samples from PRJNA573298 contain Illumina universal adaptors. Therefore, for these 21 samples, Trimmomatic version 0.39^{40} was used to remove adaptor sequences using the flag "ILLUMINACLIP:adapters.fa:2:30:10:2:keepBothReads LEADING:3 TRAILING:3 MINLEN:36". To remove contaminations from the host and from human researchers, only read pairs that could be mapped to Manis javanica or Homo sapiens genomes by bowtie⁴¹ version 2.3.5.1 were retained for further analysis. These sequences were converted from SAM format of bowtie2 back to FASTQ format by SAMtools⁴² version 1.10 and bedtools⁴³ version 2.29.2. Following these quality-control processes, we next determined which of the 25 previously mentioned samples include a 2019-nCoV-like sequence by two searches at the protein and nucleotide levels. In the protein-level search, the 2019-nCoV spike protein sequence was searched by BLASTp³⁰ through protein sequences directly assembled from sequencing reads of a metagenome sample by Plass, a protein-level metagenome sequence assembler,⁴⁴ to identify if there were any close hits with an Evalue <0.01. Meanwhile, the nucleotide-level search selected samples where more than one pair of sequencing reads could be mapped to the 2019-nCoV genome (NCBI accession: MN908947.3) by bowtie. Both searches consistently reported that only the lung samples (SRA accessions: SRR10168376, SRR10168377, and SRR10168378) contain 2019-nCoV-like sequences. Therefore, the sequences were assembled into nucleotide and protein contigs by MEGAHIT and Plass, respectively. The assembled nucleotide and protein sequences were then aligned by BLASTn and BLASTp to the whole genome and the spike protein of 2019-nCoV, respectively, at an E-value cutoff of <0.01. Finally, we separately merged all nucleotide and protein alignments into a single pairwise alignment between 2019-nCoV and the Manis coronavirus (Manis-CoV); when multiple Manis-CoV hits cover the same 2019-nCoV region, the hit with the highest sequence identity to 2019-nCoV is used in the merged alignment.

Figure 5A presents a sketch of the draft genome for the *Manis*-CoV as compared with the released 2019-nCoV genome.⁴⁵ Overall, the assembled sequences cover 73% of the 2019-nCoV genome with 91% sequence identity. More importantly, the protein sequences assembled from these *Manis* lung samples include a partial pangolin coronavirus spike protein that is 92% identical to the 2019-nCoV spike protein (Figure 5B). This sequence identity is relatively high, considering that spike proteins are critical for the coronaviruses to invade into host cells and have the largest diversity in coronavirus genomes due to evolutionary pressure to adapt to receptors on different hosts. Notably, there are only 5 residue positions in the *Manis* coronavirus that are different from 2019-nCoV on the spike receptor binding domain compared with 19 different residue

positions between 2019-nCoV and bat coronavirus RaTG13 for the same domain (Figure 5B, black box). These data imply that pangolins such as *Manis javanica* can either be the intermediate hosts of 2019-nCoV for the transmission of bat coronaviruses to humans or serve as alternative natural hosts, together with bats, to provide the genetic material for the origin of 2019-nCoV. Nevertheless, considering that *Manis javanica* individuals with coronavirus infections are usually in poor or even critical health condition³⁷ and previously known natural coronavirus hosts (such as bats) are usually asymptotic after infection, thus allowing long-term virus—host coexistence and coevolution, we believe that it is more likely that *Manis javanica* is an intermediate host rather than a natural host.

Approximately one-quarter of nucleotides are missing in our assembled *Manis* coronavirus draft genome, partly because compared with whole-genome sequencing, metagenome sequencing usually has a lower read depth and more assembly errors caused by the mixture of diverse species in the samples. A higher quality genome with better coverage should, in theory, be attainable if the *Manis* coronavirus can be isolated and cultured *in vitro* using a mammalian cell line and is subjected to whole-genome sequencing.

CONCLUSIONS

Because of the scarcity of experimental and clinical data as well as the urgency to understand the infectivity of deadly coronaviruses, we have been increasingly relying on computational analyses to study the 2019-nCoV virus in terms of protein structures, functions, phylogeny, and interactions at both molecular and organismal levels. Indeed, within less than 1 month of the publication of the 2019-nCoV genome in January 2020, multiple bioinformatics analyses regarding 2019-nCoV have been either published or posted as preprints. Whereas such expeditious analyses provide much needed insights into the biology of the 2019-nCoV virus, there is a caution to avoid overinterpretation of the data in the absence of comprehensive benchmarks or follow-up experimental validations.

In this Communication, we have investigated two recently published computational analyses regarding intermediate host identification and the analysis of spike protein insertions. In both cases, we found that the conclusions proposed by the original studies do not hold in the face of more comprehensive replications of these analyses. In particular, we found that the unique sequence "inserts" found by Pradhan et al. are, in fact, shared by multiple viruses, especially with the segments from the bat coronavirus RaTG13, revealing the close evolutionary relation to the latter species. In addition, our benchmark results showed that the data based on RSCU are not specific enough to discriminate the relation between coronaviruses and vertebrates, which contradicts the conclusion by Ji et al. regarding snakes as an immediate host of the 2019-nCoV.

Finally, we assembled a draft genome of the 2019-nCoV-like coronavirus using the metagenomic samples from the lung of *Manis javanica*, which shows an overall coverage of 73% of 2019nCoV with 91% sequence identity. In particular, the spike protein in the assembled genome, which is critical for the virus to recognize host receptors and therefore bears a high speed of variation, shares a high sequence identity with 2019-nCoV, with only 5 residue position differences compared with 19 differences between 2019-nCoV and bat coronavirus RaTG13. These data provide evidence of the possible evolutionary relations among RaTG13, the *Manis* coronavirus, and 2019-nCoV.

Whereas the current evidence mainly points to the pangolin as the most likely intermediate host, it is possible for other animals to also serve as intermediate hosts for the following two reasons. First, coronaviruses are known to have multiple intermediate hosts. For example, SARS-CoV, of which the palm civet (Paguma larvata) is the most well-known intermediate host, is also reported to use a raccoon dog (Nyctereutes procyonoides) and a ferret badger (Melogale moschata) as intermediate hosts.⁴⁶ Second, the 91% sequence identity between the Manis coronavirus and 2019-nCoV is high enough to confirm an evolutionary relation between the two viruses but not high enough to consider them as the same viral species. To put this into perspective, the viral sequence from intermediate hosts of SARS-CoV and MERS-CoV are 99.8 and 99.9% identical to their human versions, respectively.^{46,47} Therefore, even with the discovery of Manis coronavirus, further searching for other potential intermediate hosts should be continued.

ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jproteome.0c00129.

Figure S1. Top 20 vertebrate species ranked in ascending order of squared Euclidean distance of RSCU to 2019nCoV, SARS-CoV, and MERS-CoV. Table S1. Squared Euclidean distances of RSCU among coronaviruses and representative vertebrate species (PDF)

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Author Contributions

Y.Z. conceived and designed this study. C.Z. performed the RSCU analysis and structure analysis. C.Z. and W.Z. performed the sequence analysis of the spike protein. X.G. performed the domain assembly of the spike protein. C.Z., W.Z., X.H., E.W.B., and Y.Z. wrote the manuscript.

Notes

The authors declare no competing financial interest.

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ABBREVIATIONS

2019-nCoV, 2019 novel coronavirus; ACE2, angiotensinconverting enzyme 2; HIV-1, human immunodeficiency virus 1; IS, insertion; SARS-CoV, severe acute respiratory syndromerelated coronavirus; RBD, receptor binding domain; CDS, protein coding sequence; MERS-CoV, Middle East respiratory syndrome-related coronavirus; RSCU, relative synonymous codon usage; *Manis*-CoV, coronavirus infecting *Manis javanica* lung

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