

RESEARCH ARTICLE

Increased preference for lysine over arginine in spike proteins of SARS-CoV-2 BA.2.86 variant and its daughter lineages

Anže Božič^{1*}, Rudolf Podgornik^{1,2,3,4}

1 Department of Theoretical Physics, Jožef Stefan Institute, Ljubljana, Slovenia, **2** School of Physical Sciences, University of Chinese Academy of Sciences, Beijing, China, **3** Kavli Institute for Theoretical Sciences, University of Chinese Academy of Sciences, Beijing, China, **4** Wenzhou Institute, University of Chinese Academy of Sciences, Wenzhou, China

* anze.bozic@ijs.si



OPEN ACCESS

Citation: Božič A, Podgornik R (2025) Increased preference for lysine over arginine in spike proteins of SARS-CoV-2 BA.2.86 variant and its daughter lineages. PLoS ONE 20(4): e0320891. <https://doi.org/10.1371/journal.pone.0320891>

Editor: Mauricio Comas-Garcia, Universidad Autónoma de San Luis Potosí, MEXICO

Received: November 09, 2024

Accepted: February 25, 2025

Published: April 7, 2025

Copyright: © 2025 Božič, Podgornik. This is an open access article distributed under the terms of the [Creative Commons Attribution License](https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data availability statement: Data underlying the results presented in the study are publicly available in OSF at <https://osf.io/pfzbfj/>, reference number PFZBJ.

Funding: AB acknowledges support from Slovenian Research Agency (ARIS) under contracts no. P1-0055 and no. J1-60002. RP acknowledges support from National Natural Science Foundation of China (NSFC) [Key Project 12034019]. The funders had no role in study design, data collection and analysis,

Abstract

The COVID-19 pandemic offered an unprecedented glimpse into the evolution of its causative virus, SARS-CoV-2. It has been estimated that since its outbreak in late 2019, the virus has explored all possible alternatives in terms of missense mutations for all sites of its polypeptide chain. Spike protein of the virus exhibits the largest sequence variation in particular, with many individual mutations impacting target recognition, cellular entry, and endosomal escape of the virus. Moreover, recent studies unveiled a significant increase in the total charge on the spike protein during the evolution of the virus in the initial period of the pandemic. While this trend has recently come to a halt, we perform a sequence-based analysis of the spike protein of 2665 SARS-CoV-2 variants which shows that mutations in ionizable amino acids continue to occur with the newly emerging variants, with notable differences between lineages from different clades. What is more, we show that within mutations of amino acids which can acquire positive charge, the spike protein of SARS-CoV-2 exhibits a prominent preference for lysine residues over arginine residues. This lysine-to-arginine ratio increased at several points during spike protein evolution, most recently with BA.2.86 and its sublineages, including the recently dominant JN.1, KP.3, and XEC variants. The increased ratio is a consequence of mutations in different structural regions of the spike protein and is now among the highest among viral species in the *Coronaviridae* family. The impact of high lysine-to-arginine ratio in the spike proteins of BA.2.86 and its daughter lineages on viral fitness remains unclear; we discuss several potential mechanisms that could play a role and that can serve as a starting point for further studies.

Introduction

Since its outbreak in late 2019, severe acute respiratory coronavirus 2 (SARS-CoV-2) has been undergoing numerous evolutionary changes which are reflected in changes in its rate of transmission, immune escape, and overall fitness [1]. The first significant change in the virus' adaptation to humans has been observed about a year into the COVID-19 pandemic with the

decision to publish, or preparation of the manuscript. There was no additional external funding received for this study.

Competing interests: The authors declare that no competing interests exist.

emergence of the first variant of concern (VOC) termed Alpha; soon thereafter, further VOCs such as Beta, Delta, and Omicron emerged and became dominant by outcompeting previous variants [1]. This process has led to the fairly recent emergence of Omicron BA.2.86 with enhanced antibody evasion [2] and the current prevalence of some of its descendant lineages, including JN.1, KP3, and XEC. Of the latter three, JN.1 shows a considerably higher infectivity and immune evasion at the expense of reduced binding to the angiotensin-converting enzyme 2 (ACE2) [3,4]; KP3, on the other hand, shows both strong immune evasion as well as increased receptor binding capability [5]. The XEC variant includes two new mutations compared to KP3, which introduce potential glycosylation sites and thus further enhance immune evasion of the virus [6].

It has been estimated that, on average, any neutral single-nucleotide mutation in the SARS-CoV-2 genome has occurred ~ 15000 independent times since its emergence, implying that the virus has already explored all possible alternatives in terms of missense mutations [7]. Variants emerged after late 2023 even appear to be incorporating reversions to residues found in other sarbecoviruses [8]. The mutational spectrum of SARS-CoV-2 is, however, highly uneven and shows preferences for certain mutations over others [9,10], which can have important structural implications [11]. Spike protein of SARS-CoV-2—and its receptor-binding (RBD) and N-terminal (NTD) domains in particular—is the part of the virus that exhibits the greatest sequence variation [12]. Various specific mutations in the spike proteins of different SARS-CoV-2 variants have been linked to increased transmissibility of the virus and its binding to ACE2 and other receptors [13–19]. Some of these mutations create changes to and from different *ionizable amino acids* (amino acids whose residues carry either a positive or negative charge) and thus have the potential to impact electrostatic interaction of the spike protein with its environment [20–24]. Pawłowski [25,26] observed a trend in the early stages of the pandemic in which mutations in ionizable amino acids acted to increase the *total charge* on the spike protein towards more positive values. This tendency, affecting the properties of the spike protein as a whole, has been confirmed by later studies on larger sets of SARS-CoV-2 lineages [27,28], which have furthermore shown a plateauing of the total charge on the spike protein with the emergence of Omicron and subsequent variants [28–30]. Protein-wide changes in the total charge are especially relevant for non-specific electrostatic interactions of the spike protein with other charged macromolecules and macromolecular substrates in its environment [31–34]. For instance, the total charge on the RBD region of the spike protein has been shown to correlate with RBD–ACE2 affinity in the early VOCs of SARS-CoV-2 [35].

Even though the early changes in the total charge on the spike protein might have come to a halt [28–30], mutations that change the number and nature of ionizable amino acids continue to occur unabated. In the recently emerged lineage BA.2.86, for example, electrostatic changes have been shown to contribute to the immune evasion of the virus [36]. In this work, we perform a sequence-based analysis of the mutations in ionizable amino acids on the spike proteins of 2665 SARS-CoV-2 lineages that have emerged since the start of the pandemic. We find that the BA.2.86 variant and its daughter lineages show a notable increase in the preference for lysine residues over arginine residues, despite the fact that both amino acid types carry positive charge and should thus have a similar effect on the resulting electrostatic interactions. What is more, we observe that the ratio of lysine to arginine in the currently prevalent SARS-CoV-2 variants is among the highest seen in different viruses from the *Coronaviridae* family. We also demonstrate that the changes to this ratio have been consistently occurring despite the fact that mutations from lysine to arginine or vice versa typically do not have a significant effect on viral fitness, ACE2 binding affinity, or RBD expression. While the impact of the high lysine-to-arginine ratio in SARS-CoV-2 variants thus remains unclear, we provide several possible reasons that could explain it.

Materials and methods

Sequences, divergence, and date of emergence of SARS-CoV-2 lineages

Data collection of sequences from different SARS-CoV-2 lineages follows our approach described previously [28,29]. In short, we use a list of SARS-CoV-2 Pango lineages from [CoV-Lineages.org](https://covid19-lineages.org) [37] (accessed 12. 12. 2024) to download SARS-CoV-2 genomic and protein data from NCBI Virus database [38] together with accompanying annotations. We define the date of emergence of a lineage as the earliest full record (i.e., year, month, and day) of isolate collection. Lineage divergence, defined through the number of mutations in the entire genome relative to the root of the phylogenetic tree (the start of the outbreak), is obtained from the global SARS-CoV-2 data available at [Nextstrain.org](https://nextstrain.org) [39] (accessed 16. 12. 2024), and only those entries with a genome coverage of > 99 % are selected. Finally, we retain the lineages whose downloaded fasta protein file is not empty, resulting in a total number of $N = 2665$ analyzed SARS-CoV-2 lineages. The final lists of analyzed lineages, the dates of their emergence, and their average divergence are available in OSF at <https://osf.io/pfzbj/>, reference number PFZBJ.

Spike protein sequences of viruses from *Coronaviridae* family

As a point of comparison, we also examine the spike proteins of other viruses belonging to the *Coronaviridae* family. We focus on the *Orthocoronavirinae* subfamily, which is composed of four genera—*Alphacoronavirus*, *Betacoronavirus*, *Gammacoronavirus*, and *Deltacoronavirus*—and contains the majority of known coronaviruses [40]. Following the approach we use for SARS-CoV-2 sequences, we use the NCBI Virus database [38] (accessed 06. 01. 2025) to download the spike protein sequences and annotations for different viruses belonging to *Orthocoronavirinae*. We retain only the entries with complete sequences without any ambiguous characters. The final dataset contains 64 viruses from genus *Alphacoronavirus*, 36 viruses from genus *Betacoronavirus* (excluding SARS-CoV-2), 8 viruses from genus *Gammacoronavirus*, and 17 viruses from genus *Deltacoronavirus*. The list of analyzed coronaviruses, their spike protein sequences, and annotations are available in OSF at <https://osf.io/pfzbj/>, reference number PFZBJ.

Ionizable amino acids

Typically, six different amino acids can acquire charge [41,42]; aspartic (ASP) and glutamic (GLU) acid as well as tyrosine (TYR) acquire negative charge while arginine (ARG), lysine (LYS), and histidine (HIS) acquire positive charge. We neglect cysteine (CYS) as it is usually not considered to be an acid [41,42]. We use Biopython [43] to parse the downloaded protein fasta files and count the number of ionizable amino acids on the spike proteins of different SARS-CoV-2 lineages. The results of this analysis are available in OSF at <https://osf.io/pfzbj/>, reference number PFZBJ.

To compare the relative change in the number of ionizable amino acids on the spike proteins of different lineages compared to the wild-type (WT) version (lineage B), we define

$$\bar{\delta}(\text{AA}) = \frac{\bar{N}(\text{lineage})}{\bar{N}(\text{WT B})} - 1, \quad (1)$$

where \bar{X} denotes the average over all spike protein sequences included under each lineage. This measure allows for an easier comparison of the patterns of change in the number of ionizable amino acids in a large number different SARS-CoV-2 lineages.

Effects of mutations on SARS-CoV-2 fitness

To study the effect of mutations of ionizable amino acids on different aspects of SARS-CoV-2 fitness, we use publicly available datasets from several studies. Foremost, we use the data from Ref. [10], where the effect of mutations on viral fitness was estimated through the logarithm of observed vs. expected mutations in a large dataset of SARS-CoV-2 sequences (<https://github.com/jbloomlab/SARS2-mut-fitness>; accessed 24. 12. 2024). We furthermore use the data from Ref. [18] which contains the effects of all single amino-acid mutations on the binding of the spike protein to ACE2 as well as on RBD expression—a proxy for folding and stability—in the context of several SARS-CoV-2 variants (https://github.com/jbloomlab/SARS-CoV-2-RBD_DMS_variants/; accessed 24. 12. 2024).

Results

Lineage-specific changes in the number of ionizable amino acids on the spike protein

Of the six ionizable amino acid types that typically carry charge, three of them are negatively charged (TYR, ASP, and GLU), and three of them are positively charged (ARG, LYS, and HIS). Missense mutations involving these amino acids can thus either (i) convert a neutral amino acid to a charged one or vice versa; (ii) convert a positively charged amino acid to a negatively charged one (or vice versa); or (iii) convert between different amino acid types that otherwise carry the same charge. Fig 1 shows the average relative change in the number of ionizable amino acids on the spike proteins of different SARS-CoV-2 lineages compared to WT lineage B. First thing we observe is that these mutations lead to distinct profiles of changes as lineage divergence increases, and we have already shown previously that the clustering of lineages based on these patterns of change broadly follows their phylogenetic division into clades [29]. The currently dominant set of lineages, which includes JN.1, KP.3, and XEC and traces their origin to the BA.2.86 variant, presents a very distinct cluster characterized by a notable increase in the number of LYS residues and a decrease in the number of ARG and GLU residues (highlighted box in Fig 1). The pattern of change in this cluster is very distinct from previous variants, including, for instance, XBB and other recombinant variants, which show a high relative enrichment and variability in the number of HIS residues but less drastic changes to the number of ARG and LYS residues. The recently emerged variants also exhibit large changes compared to the early VOCs such as Beta and Delta, where the increase towards overall positive charge on the spike protein was first observed [25,26].

We can also look into the relative changes in the number of ionizable amino acids on three of the main structural domains of the spike protein, the N-terminal domain (NTD), RBD, and S2 domain. While the changes in the number of ionizable amino acids act globally to influence the total charge carried by the spike protein, their distribution within the structural domains is far from uniform, and each domain can be characterized by a particular pattern of changes (figure in S1 Fig). The spike protein RBD is known to be positively charged for a broad range of pH values [44,45], and the evolutionary changes in ionizable amino acids in this region have generally acted to increase the amount of positive charge, in particular by increases in both the number of LYS and HIS residues. The NTD, on the other hand, shows a decrease in the number of ARG and HIS residues which act to decrease the amount of positive charge; this corresponds with previous studies showing that this region underwent several changes during SARS-CoV-2 evolution which made it overall negative [46]. Lastly, the stalk moiety of the spike protein—the S2 domain—is evolutionary very conserved and is known

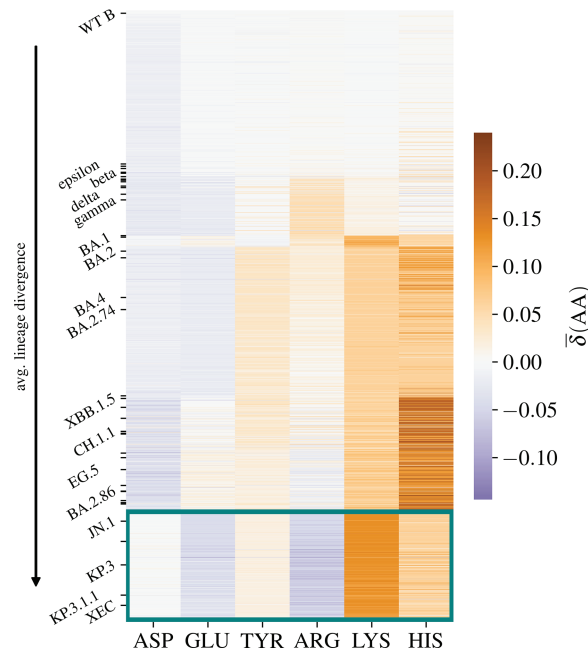


Fig 1. Average change in the number of ionizable amino acids on the spike protein of SARS-CoV-2 lineages. Shown is the average change $\bar{\delta}(\text{AA})$ [Eq (1)] in the number of negatively charged (ASP, GLU, and TYR) and positively charged (ARG, LYS, and HIS) amino acids on the spike protein of 2665 different SARS-CoV-2 lineages compared to WT lineage B. A relative change of 10% typically corresponds to an addition or deletion of ~ 5 residues, depending on the amino acid in question (see also Fig 2). Lineages are ordered according to their (average) divergence from WT B. Highlighted box includes the currently dominant set of lineages, including JN.1, KP.3, KP.3.1.1, and XEC, all showing similar patterns of change in the number of ionizable amino acids.

<https://doi.org/10.1371/journal.pone.0320891.g001>

to be overall negatively charged [44,45]; there, we observe a pattern of change virtually conserved since the emergence of Omicron variant, at which point the number of LYS, HIS, and TYR residues have increased.

Lysine-to-arginine ratio has increased several times during spike protein evolution

Changes in the number of ionizable amino acids on the spike protein thus continue to occur unabated despite the fact that the early increase in the total charge on the spike protein [25–28] had essentially stopped with the emergence of Omicron and later lineages [28,29]. Even if they do not impact the total charge, mutations of charged amino acids can still have significant influence on both the properties of the spike protein as well as on the overall viral fitness [17,47]. A particularly notable trend in the recently emerged SARS-CoV-2 lineages is the relative decrease in the number of ARG residues (Fig 2a) and a simultaneous increase in the number of LYS residues (Fig 2e). The increase in the number of LYS residues—from ~ 60 at the start of the COVID-19 pandemic to ~ 70 with the most recently emerged lineages—stands out in particular and is the main reason for the observed increase in the LYS/ARG ratio (Fig 2m). This ratio has increased twice during the timespan of the pandemic, first with the early Omicron lineages—where also the total charge on the spike protein reached its peak [28,29]—and next with the recent emergence of BA.2.86 and its daughter lineages. In contrast to LYS and ARG, HIS, another positively charged amino acid, shows larger variability with lineage divergence and no clear evolutionary trend (Fig 2i).

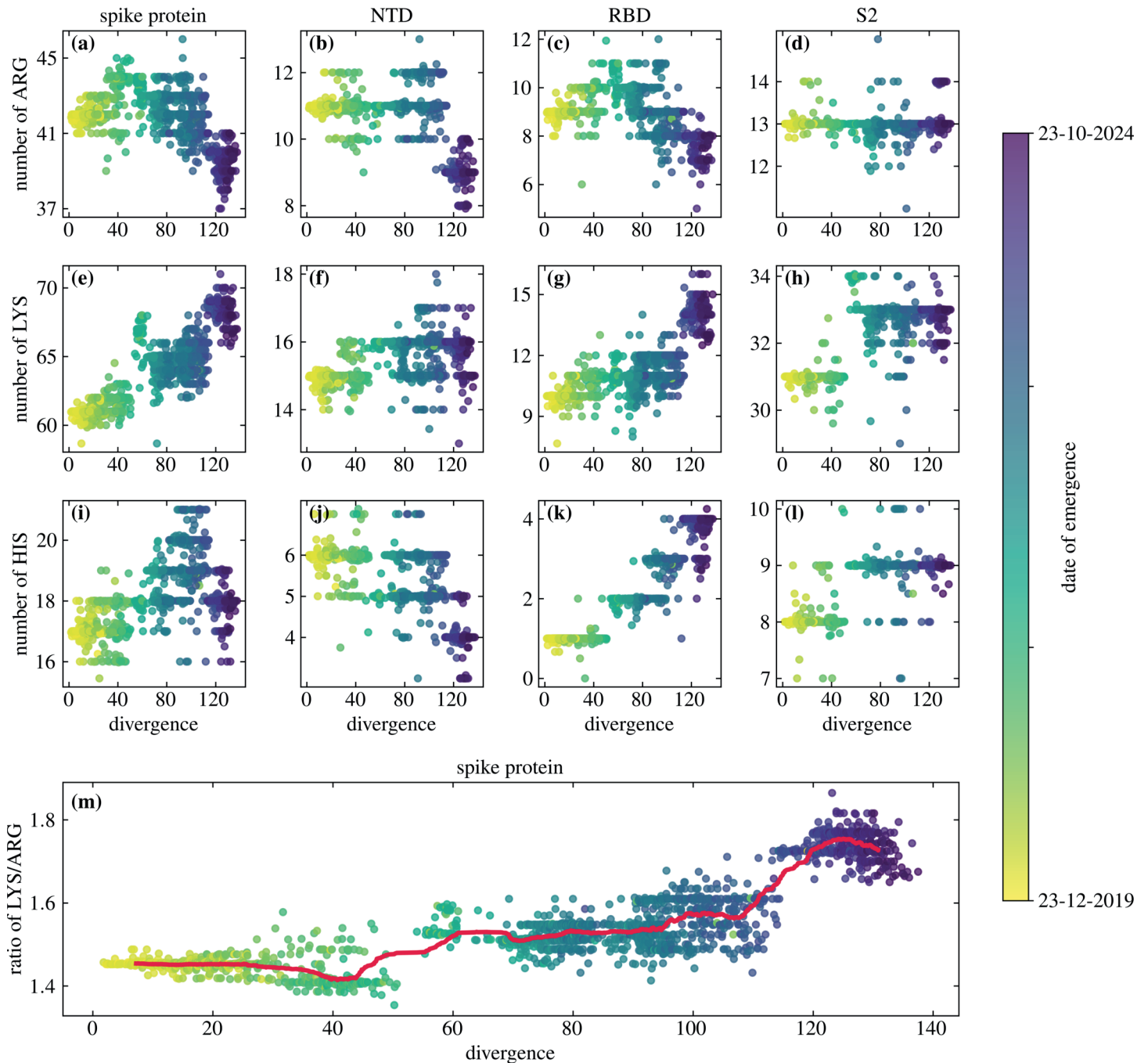


Fig 2. Evolutionary changes in the number of arginine, lysine, and histidine residues on the spike protein of SARS-CoV-2 and its different regions. Shown is the change in the number of (a)–(d) ARG, (e)–(h) LYS, and (i)–(l) HIS residues, both on the entire spike protein (first column) as well as on the N-terminal domain (NTD; second column), receptor-binding domain (RBD; third column) and S2 region (fourth column) alone. Panel (m) shows the ratio of LYS to ARG on the entire spike protein as a function of the (average) divergence. Each point in the panels represents one of the 2665 different SARS-CoV-2 lineages analyzed. Thick line in panel (m) shows a rolling average of the LYS/ARG ratio with lineage divergence (window size contains 100 lineages).

<https://doi.org/10.1371/journal.pone.0320891.g002>

Looking further into the variation in the number of LYS and ARG residues in specific structural domains of the spike protein shows that these changes have not occurred simultaneously throughout the protein (Figs 2 and 3 and figure in S2 Fig). The first notable increase

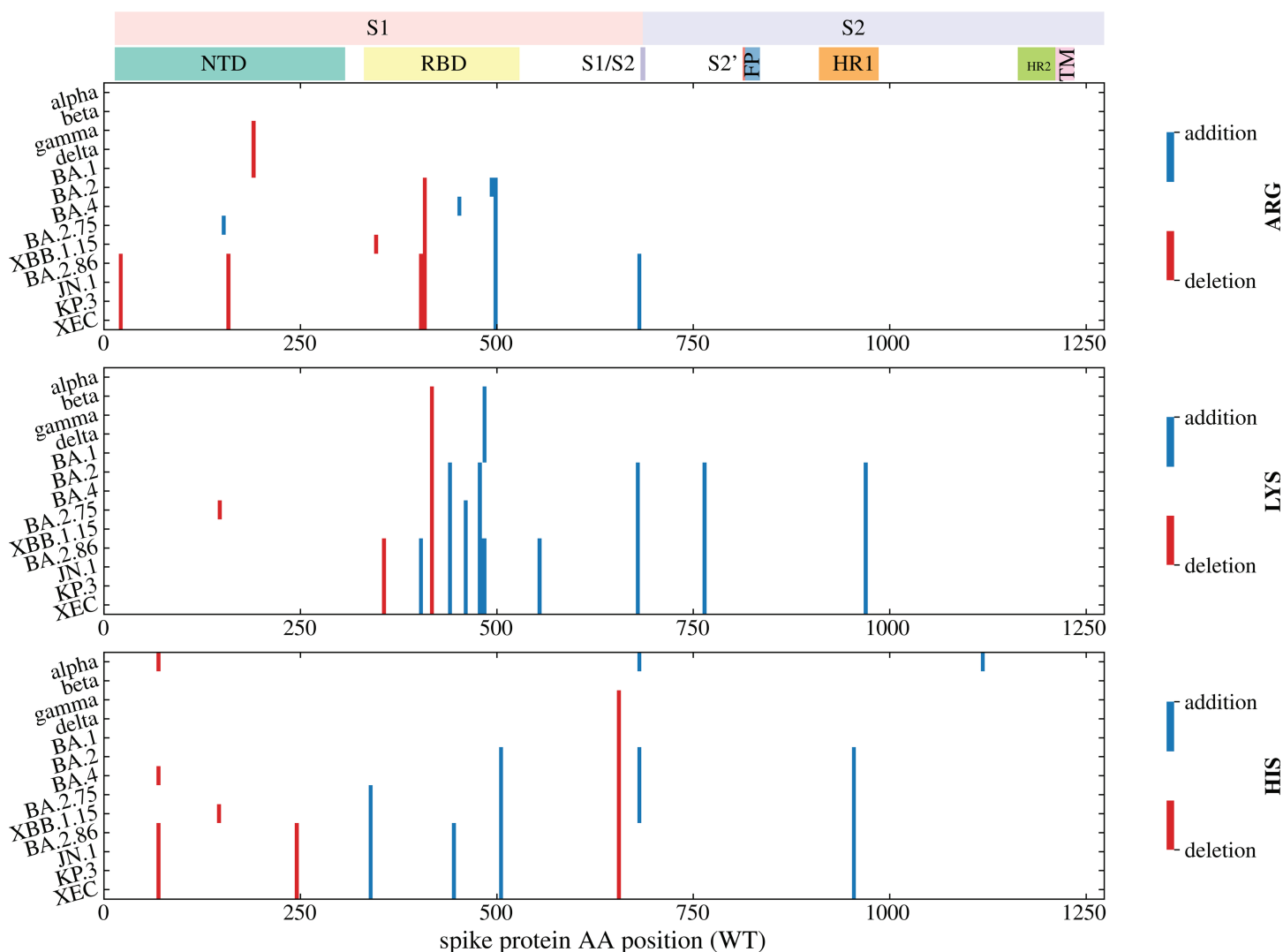


Fig 3. Characteristic mutations in arginine, lysine, and histidine residues in the spike proteins of select SARS-CoV-2 variants. Shown are those substitutions to ("addition") or from ("deletion") three positively-charged amino acid types (ARG, LYS, and HIS) that occur in at least 70% of the spike protein sequences of a given variant (data from CoV-Spectrum.org [48]; accessed 08. 01. 2025). The positions of the mutations on the spike protein amino acid sequence are annotated with some of the more important regions: NTD, N-terminal domain; RBD, receptor-binding domain; S1/S2, furin cleavage site; S2', S2' cleavage site; FP, fusion peptide and fusion-peptide proximal region; HR, hexad repeat; TM, transmembrane anchor.

<https://doi.org/10.1371/journal.pone.0320891.g003>

in the LYS/ARG ratio has mainly occurred in the S2 domain (figure in S2 Fig) and is largely due to the addition of several new LYS residues (Figs 2h and 3). The second notable increase occurred due to further new substitutions to LYS residues and from ARG residues in the RBD region of the spike protein (Figs 2c and 2g and figure in S2 Fig). This is further illustrated in Fig 3, which shows the characteristic substitutions in the three positively charged amino acid types of select SARS-CoV-2 variants. Substitutions to and from LYS and ARG residues most often occur in the RBD region of the spike protein, and several of these mutations are characteristic of only the BA.2.86 variant and its descendant lineages. The NTD region, on the other hand, exhibits only a few substitutions from ARG, which is in line with observations that this region tends to acquire a more negative charge [46].

Betacoronaviruses have the highest lysine-to-arginine ratio in *Coronaviridae*

To better understand the importance of the observed increase in the LYS/ARG ratio in emerging SARS-CoV-2 variants, we also take a look at this ratio in the spike proteins of other viral species from the *Coronaviridae* family. As Fig 4 shows, viruses in the *Betacoronavirus* genus have a significantly higher ratio of LYS/ARG compared to viruses from *Alphacoronavirus* and *Deltacoronavirus* genera (Brunner-Munzel test, $p < 0.0001$). Even more interesting is the fact that the mean value of LYS/ARG ratio in betacoronaviruses (LYS/ARG ≈ 1.34) corresponds well with the minimum value of this ratio obtained by any SARS-CoV-2 lineage (LYS/ARG ≈ 1.35 ; lower dashed line in Fig 4). Moreover, while a number of betacoronaviruses have the value of this ratio above the mean—with the maximum in our dataset achieved by the spike protein of Hedgehog coronavirus 1 (LYS/ARG ≈ 1.68)—this is still far from the maximum value achieved by any SARS-CoV-2 lineage thus far (LYS/ARG ≈ 1.86 ; upper dashed line in Fig 4). These observations show that upon emergence, the initial LYS/ARG ratio of the SARS-CoV-2 spike protein was around the average value characteristic of betacoronaviruses; however, this ratio has increased during its evolution to values not found in any of the viruses in the dataset of *Coronaviridae* we examined.

Replacing spike protein lysines with arginines does not significantly impact viral fitness

The increase in the LYS/ARG ratio during the evolution of SARS-CoV-2 is particularly interesting since it does not in any obvious way impact the overall positive charge on the spike

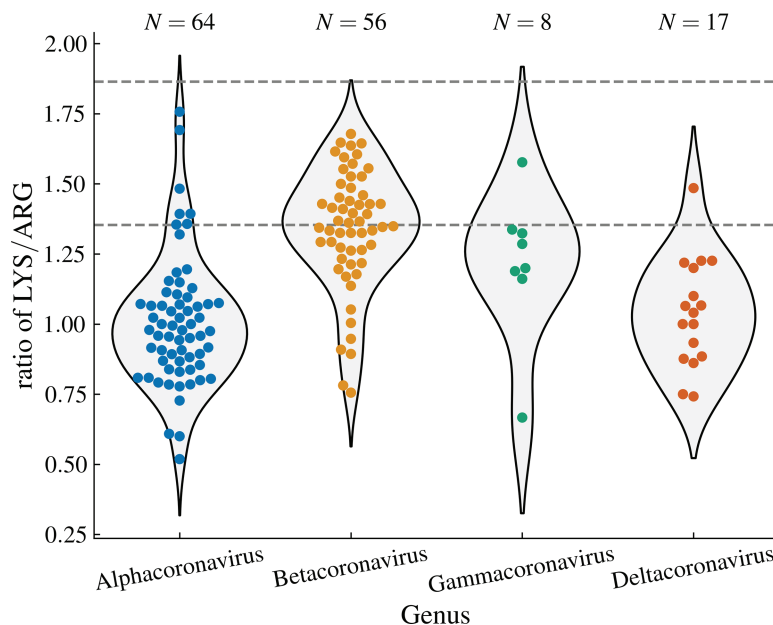


Fig 4. Ratio of lysine to arginine in the spike proteins of different viral species belonging to *Coronaviridae* family. Shown are the violin plots as well as individual data points for viruses belonging to the four genera in the *Orthocoronavirinae* subfamily. Each data point represents a species with a unique name in the NCBI Virus database [38], with the ratio averaged over all database entries for that species. Dashed lines show the minimum and maximum value of the ratio that are obtained by the analyzed SARS-CoV-2 lineages (see Fig 2).

<https://doi.org/10.1371/journal.pone.0320891.g004>

protein, and we need to explore other potential reasons for this change. We can draw on previous studies which have explored how mutations impact different aspects of SARS-CoV-2 fitness [10,49] to examine whether ARG↔LYS mutations in the spike protein come with some consequence for viral fitness. If so, this would then imply that the mutations of an amino acid to LYS comes with a benefit which would not be present if the amino acid were mutated to ARG instead.

Change in viral fitness was for instance estimated by Bloom and Neher [10] as the logarithm of actual vs. observed mutation counts in publicly available SARS-CoV-2 sequences. Fig 5 shows this change in viral fitness if ARG residues are replaced by LYS residues and vice versa. In the spike protein (Fig 5a), the change of LYS to ARG typically does not come with a change in viral fitness. Changing ARG to LYS, on the other hand, sometimes leads to a larger decrease in viral fitness, implying that certain ARG residues are crucial to it. This difference is, interestingly, not bound to the spike protein but can be observed even more strongly when we consider these mutations in all other protein-coding genes (Fig 5b). On the other hand, if one considers mutations from ARG to any other residue or from any residue to LYS, this effect disappears (Figure in S3 Fig), in line with a previous report that most (but not all) mutations have similar effects on the spike proteins of different SARS-CoV-2 variants [17].

A similar difference between the effects of LYS → ARG and ARG → LYS substitutions in the spike protein can be observed when we utilize the data of Taylor *et al.* [49], who measured the change in the binding affinity of the spike protein to ACE2 or in the expression of RBD upon mutations in select SARS-CoV-2 variants (figure in S4 Fig). While changing any LYS residue to an ARG residue has little effect on any of the two measures, this is conversely not always the case when an ARG residue is changed to a LYS residue. That the effects of LYS↔ARG mutations should be similar between the two datasets is not surprising, as

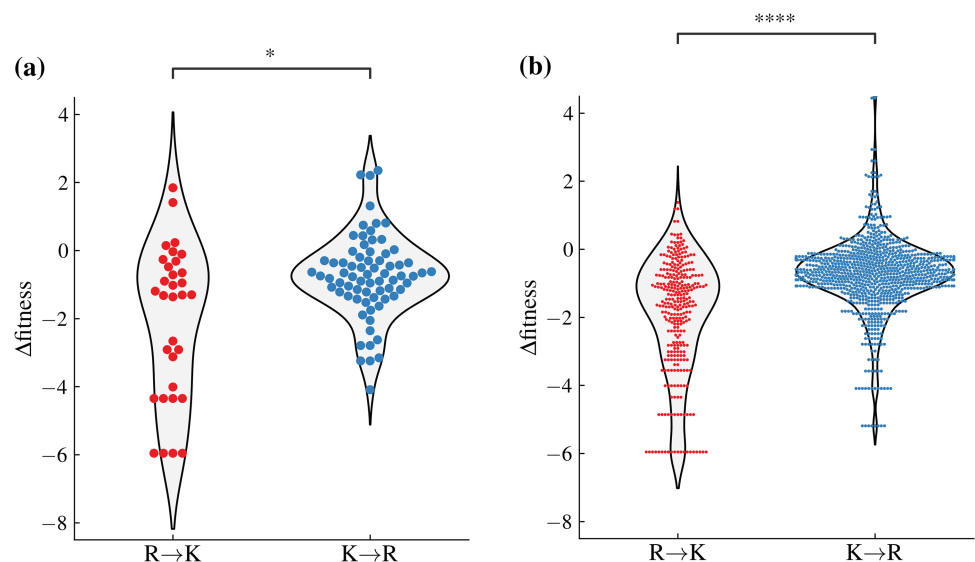


Fig 5. Influence of mutations between arginine and lysine on SARS-CoV-2 fitness. Viral fitness is estimated as the logarithm of actual vs. observed mutation counts in all publicly available SARS-CoV-2 sequences as of March 2023; data are taken from Ref. [10]. Shown are the mutations in (a) the spike protein and in (b) all other protein-coding regions. Mutation from arginine to lysine (R→K) and from lysine to arginine (K→R) have different effect on viral fitness in both datasets (Brunner-Munzel test; (a) $p = 0.018$ and (b) $p < 0.0001$).

<https://doi.org/10.1371/journal.pone.0320891.g005>

another study [17] already showed that the effects of mutations on cell entry were fairly well correlated with the effects of amino-acid mutations on viral fitness. Since these data imply LYS→ARG mutations do not influence the obvious markers of SARS-CoV-2 fitness, there should thus be yet another reason still why mutations to LYS nonetheless seem to be preferred over mutations to ARG.

Discussion

Studies have shown that viral proteins generally tend to contain more ARG than LYS [50] and that an infected cell absorbs far more ARG from the culture medium than an uninfected one [51]. This led to the idea of diet restriction of ARG-rich foods during viral illnesses [52] and supplementation with LYS, its antagonist, which attenuates the growth-promoting effect of ARG [53]. There is a competitive antagonism between LYS and ARG, and if a cell gets saturated in one of the two, its absorption slows and leaves the other free to be more absorbed [54]. Some studies have shown positive results of ARG depletion on treating viral infections [52,54], including SARS-CoV-2 [55]; however, a recent study by Rees *et al.* [56] suggests this might potentially exacerbate the effects of the infection by SARS-CoV-2 instead. Moreover, a study by Melano *et al.* [57] has demonstrated that it is in fact LYS restriction that can attenuate SARS-CoV-2 infection, which appears to be in line with our observation that SARS-CoV-2 spike proteins of recent lineages increasingly prefer LYS over ARG (Fig 2). This is also a common feature we observe in other coronavirus spike proteins as well (Fig 4) and which stands in contrast to what is typically observed in other viruses [50].

The increasing ratio of LYS/ARG in spike proteins of emerging SARS-CoV-2 variants, high even in comparison to other betacoronaviruses, cannot be simply related to codon usage bias. While it is true that ARG is coded for by six codons and LYS by only two, codon usage bias in SARS-CoV-2 and other coronaviruses suggests that CpG codons are suppressed, with only two out of the six ARG codons being predominantly in use [58,59]. However, the reasons behind the preference for LYS over ARG might be related to their physicochemical properties. For instance, in the membrane, LYS residues readily deprotonate while ARG residues maintain their charge [60,61] and can more easily disrupt and permeabilize lipid membranes. ARG also forms a larger number of electrostatic interactions with the surrounding compared to LYS [62,63]. Thus, preference for LYS over ARG could favourably influence the electrostatic interactions involving SARS-CoV-2 spike protein in specific environments [31,64,65].

Studies have also shown that preference for LYS over ARG can influence protein structural stability and folding [62,66,67], and a computational structural analysis of SARS-CoV-2 spike protein revealed that three specific mutations of asparagine (N) to lysine in the central core region (N764K, N856K, and N969K) contribute to a preference for the alteration of the spike protein conformations [68,69]. Furthermore, the ratio of ARG to LYS is a known factor in determining protein solubility and aggregation, with LYS being enriched relative to ARG in many of the more soluble proteins [67,70–73]. However, a quick comparison of the spike protein solubilities in SARS-CoV-2 variants, predicted from their sequence using *protein-sol* [74], shows no difference between them despite their different LYS/ARG ratios. Even more, such an analysis performed on spike proteins of different coronaviruses indicates that spike protein solubility in general does not change much once the LYS/ARG ratio is sufficiently large ($\text{LYS/ARG} \gtrsim 1.2$; figure in S5 Fig). While a more detailed analysis performed on spike protein structures would be needed to obtain more reliable estimates [75], these results indicate that the observed increase in LYS/ARG ratio in spike proteins of SARS-CoV-2 variants is unlikely to modify their solubility.

An important difference between ARG and LYS is that the latter is far more prone to post-translational modifications (PTMs) [76,77]. While both amino acids can undergo methylation, LYS residues can also undergo ubiquitination, which can regulate the association of the spike protein with ACE2 [78], and acetylation, which can contribute to a range of virus–virus and virus–host interactions by, e.g., regulating interactions between proteins and membranes and enabling generation of novel protein-binding recognition surfaces [79–83]. What is more, LYS acetylation is a reversible process that leads to neutralization of the position's positive electrostatic charge [84] and can contribute to structural changes [85,86]. While PTMs have been mostly studied on non-spike proteins of SARS-CoV-2 [87], a computational study by Liang *al.* [85] identified 87 PTM sites from 5 major modifications on the spike protein of SARS-CoV-2 variant Alpha, of which the largest number of modified sites corresponded to glycosylation (39 residues) followed by acetylation (21 residues). The influence of these PTMs was studied via “mutagenesis” amino acid substitution rules, which in the case of LYS and ARG residues corresponds to the substitution LYS \leftrightarrow ARG. This study [85] nonetheless did not observe any marked difference between the spike protein's unmodified and modified structures, especially for the functional regions in the S1 and S2 domains. Since Alpha variant is situated at the very beginning of SARS-CoV-2 evolution, more insight is needed into PTMs in the spike proteins of recently emerged variants whose profiles of ionizable amino acids are, as we have seen, characterized by numerous new LYS residues.

Lastly, it is possible that the observed increase in the LYS/ARG ratio on the spike proteins of emerging SARS-CoV-2 variants—which does not increase the overall charge on the spike protein nor is easily related to any obvious markers of viral fitness—can be related to the attenuation of SARS-CoV-2 as a part of its adaptation to the new host. Upon cross-species transmission of a virus, its virulence often becomes markedly more lethal [88], which is also the case with SARS-CoV-2 [89]. In the initial evolution of SARS-CoV-2, transmissibility and virulence could increase in parallel. This trajectory changed with the emergence of Omicron whose increased transmission (partly due to changes in ionizable amino acids [90]) came at the expense of a decrease in virulence [89]. This is characteristic of the virulence-transmission trade-off hypothesis [88,91], which predicts the selection of phenotypes with intermediate viral fitness. Such a relationship is, however, difficult to establish [88], especially in the light of the complex interplay of SARS-CoV-2 biology in the context of changing immunity due to both vaccination, antiviral drugs, and prior infection [1,89].

Conclusion

By examining the changes in the number of ionizable amino acids in the spike protein sequences of 2665 SARS-CoV-2 variants that have emerged since the start of the COVID-19 pandemic, our study identified an increasing ratio of LYS to ARG residues in the spike protein. This is a consequence of mutations that have been occurring since the early Omicron variants and which have seen a recent uptick with BA.2.86 and its daughter lineages. We have shown that these changes have been occurring throughout the spike protein, albeit not in all the structural domains simultaneously. Comparing the observed LYS/ARG ratios with those of other coronaviruses, we observed that even though this ratio is in general higher in betacoronaviruses compared to other genera, the values it reached in the recently emerged SARS-CoV-2 variants are not seen in any other species in *Orthocoronavirinae*. Combined with observations from previous studies [10,49], we also showed that the choice of LYS over ARG in the mutations found in emerging lineages most often does not come with a significant benefit associated with viral fitness, binding with the ACE2 receptor, or the expression of RBD. While the reasons behind the increase in the LYS/ARG ratio thus remain an open

question, we have outlined several potential mechanisms that could play a role and that can hopefully serve as a starting point for further studies.

Supporting information

S1 Fig Average change in the number of ionizable amino acids on different structural regions of the spike protein of SARS-CoV-2 lineages. Shown are the changes in the N-terminal domain (NTD), receptor-binding domain (RBD), and S2 domain of the spike protein. Region boundaries are taken from Ref. [92] and are determined with respect to the WT SARS-CoV-2 spike protein sequence. Panels show the average change $\bar{\delta}(\text{AA})$ [Eq (1)] in the number of negatively charged (ASP, GLU, and TYR) and positively charged (ARG, LYS, and HIS) amino acids of 2665 different SARS-CoV-2 lineages compared to WT lineage B. Lineages are ordered according to their (average) divergence from WT B. (TIF)

S2 Fig Evolutionary changes in the ratio of lysine to arginine on different structural regions of the spike protein of SARS-CoV-2 lineages. Shown are the changes in the LYS/ARG ratio in the (a) NTD, (b) RBD, and (c) S2 domain as a function of the (average) lineage divergence. Each point in the panels represents one of the 2665 different SARS-CoV-2 lineages analyzed. Thick lines show a rolling average of the LYS/ARG ratio with lineage divergence (window size contains 100 lineages). (TIF)

S3 Fig Influence of arginine and lysine mutations on SARS-CoV-2 fitness. Viral fitness is estimated as the logarithm of actual vs. observed mutation counts in publicly available SARS-CoV-2 sequences as of March 2023; data are taken from Ref. [10]. Compared are the mutations in the spike protein from arginine to any amino acid ($R \rightarrow \text{any}$) and from any amino acid to lysine ($\text{any} \rightarrow K$). These two types of mutations do not differ significantly in their effect on viral fitness (Brunner-Munzel test, $p = 0.06$). (TIF)

S4 Fig Influence of mutations between arginine and lysine on different aspects of SARS-CoV-2 fitness. Shown are the effects of spike protein mutations from ARG to LYS and vice versa on (a) ACE2 binding affinity and (b) RBD expression of select SARS-CoV-2 variants. Data are taken from Ref. [49]. (TIF)

S5 Fig Ratio of lysine to arginine in spike proteins of different coronaviruses compared to their predicted (scaled) solubility. Dataset of viruses from the four genera of *Orthocoronavirinae* subfamily is the same as in Fig 4 in the main text. Scaled solubility was predicted from spike protein sequences using *protein-sol* [74]. Dashed line shows the predicted scaled solubility of 0.289, which is predicted to be the same for the entire dataset of SARS-CoV-2 spike protein sequences. (TIF)

Author contributions

Conceptualization: Anže Božič, Rudolf Podgornik.

Formal analysis: Anže Božič.

Funding acquisition: Anže Božič, Rudolf Podgornik.

Investigation: Anže Božič, Rudolf Podgornik.

Methodology: Anže Božič.

Visualization: Anže Božič.

Writing – original draft: Anže Božič.

Writing – review & editing: Anže Božič, Rudolf Podgornik.

References

1. Carabelli AM, Peacock TP, Thorne LG, Harvey WT, Hughes J, COVID-19 Genomics UK Consortium, et al. SARS-CoV-2 variant biology: Immune escape, transmission and fitness. *Nat Rev Microbiol.* 2023;21(3):162–77. <https://doi.org/10.1038/s41579-022-00841-7> PMID: 36653446
2. Yang H, Guo H, Wang A, Cao L, Fan Q, Jiang J, et al. Structural basis for the evolution and antibody evasion of SARS-CoV-2 BA.2.86 and JN.1 subvariants. *Nat Commun.* 2024;15:7715.
3. Yang S, Yu Y, Xu Y, Jian F, Song W, Yisimayi A, et al. Fast evolution of SARS-CoV-2 BA.2.86 to JN.1 under heavy immune pressure. *Lancet Infect Dis.* 2024;24(2):e70–2. [https://doi.org/10.1016/S1473-3099\(23\)00744-2](https://doi.org/10.1016/S1473-3099(23)00744-2) PMID: 38109919
4. Kaku Y, Okumura K, Padilla-Blanco M, Kosugi Y, Uriu K, Hinay AA Jr, et al. Virological characteristics of the SARS-CoV-2 JN.1 variant. *Lancet Infect Dis.* 2024;24(2):e82. [https://doi.org/10.1016/S1473-3099\(23\)00813-7](https://doi.org/10.1016/S1473-3099(23)00813-7) PMID: 38184005
5. Jian F, Wang J, Yisimayi A, Song W, Xu Y, Chen X, et al. Evolving antibody response to SARS-CoV-2 antigenic shift from XBB to JN.1. 2024. <https://doi.org/10.1101/2024.04.19.590276>
6. Liu J, Yu Y, Jian F, Yang S, Song W, Wang P, et al. Enhanced immune evasion of SARS-CoV-2 variants KP. 3.1. 1 and XEC through N-terminal domain mutations. *Lancet Infect Dis.* 2024.
7. Balasco N, Damaggio G, Esposito L, Colonna V, Vitagliano L. A comprehensive analysis of SARS-CoV-2 missense mutations indicates that all possible amino acid replacements in the viral proteins occurred within the first two-and-a-half years of the pandemic. *Int J Biol Macromol.* 2024;266(Pt 1):131054. <https://doi.org/10.1016/j.ijbiomac.2024.131054> PMID: 38522702
8. Feng Z, Huang J, Baboo S, Diedrich J, Bangaru S, Paulson J. Structural and functional insights into the evolution of SARS-CoV-2 KP. 3.1. 1 spike protein. *bioRxiv*; 2024. p. 2024–12.
9. Bloom JD, Beichman AC, Neher RA, Harris K. Evolution of the SARS-CoV-2 mutational spectrum. *Mol Biol Evol.* 2023;40(4):msad085. <https://doi.org/10.1093/molbev/msad085> PMID: 37039557
10. Bloom JD, Neher RA. Fitness effects of mutations to SARS-CoV-2 proteins. *Virus Evolut.* 2023;9:vead055.
11. Wang Q, Guo Y, Liu L, Schwanz LT, Li Z, Nair MS, et al. Antigenicity and receptor affinity of SARS-CoV-2 BA.2.86 spike. *Nature.* 2023;624(7992):639–44. <https://doi.org/10.1038/s41586-023-06750-w> PMID: 37871613
12. Harvey WT, Carabelli AM, Jackson B, Gupta RK, Thomson EC, Harrison EM, et al. SARS-CoV-2 variants, spike mutations and immune escape. *Nat Rev Microbiol.* 2021;19(7):409–24. <https://doi.org/10.1038/s41579-021-00573-0> PMID: 34075212
13. Jawad B, Adhikari P, Podgornik R, Ching W-Y. Binding interactions between receptor-binding domain of spike protein and human angiotensin converting enzyme-2 in omicron variant. *J Phys Chem Lett.* 2022;13(17):3915–21. <https://doi.org/10.1021/acs.jpcclett.2c00423> PMID: 35481766
14. Obermeyer F, Jankowiak M, Barkas N, Schaffner SF, Pyle JD, Yurkovetskiy L, et al. Analysis of 6.4 million SARS-CoV-2 genomes identifies mutations associated with fitness. *Science.* 2022;376(6599):1327–32. <https://doi.org/10.1126/science.abm1208> PMID: 35608456
15. Sang P, Chen YQ, Liu MT, Wang YT, Yue T, Li Y. Electrostatic interactions are the primary determinant of the binding affinity of SARS-CoV-2 Spike RBD to ACE2: A computational case study of omicron variants. *Int J Mol Sci.* 2022;23(23):14796. <https://doi.org/10.3390/ijms232314796>
16. Zhang W, Shi K, Geng Q, Ye G, Aihara H, Li F. Structural basis for mouse receptor recognition by SARS-CoV-2 omicron variant. *Proc Natl Acad Sci U S A.* 2022;119(44):e2206509119. <https://doi.org/10.1073/pnas.2206509119> PMID: 36256797
17. Dadonaite B, Brown J, McMahon TE, Farrell AG, Figgins MD, Asarnow D, et al. Spike deep mutational scanning helps predict success of SARS-CoV-2 clades. *Nature.* 2024;631(8021):617–26. <https://doi.org/10.1038/s41586-024-07636-1> PMID: 38961298
18. Starr TN, Greaney AJ, Hannon WW, Loes AN, Hauser K, Dillen JR, et al. Shifting mutational constraints in the SARS-CoV-2 receptor-binding domain during viral evolution. *Science.* 2022;377(6604):420–4. <https://doi.org/10.1126/science.abo7896> PMID: 35762884

19. Dadonaite B, Crawford KH, Radford CE, Farrell AG, Timothy CY, Hannon WW, et al. A pseudovirus system enables deep mutational scanning of the full SARS-CoV-2 spike. *Cell*. 2023;186(6):1263–78. <https://doi.org/10.1016/j.cell.2023.02.001>
20. Adhikari P, Jawad B, Podgornik R, Ching W. Mutations of Omicron variant at the interface of the receptor domain motif and human angiotensin-converting enzyme-2. *Int J Mol Sci*. 2022;23:2870.
21. Adhikari P, Jawad B, Podgornik R, Ching W-Y. Quantum chemical computation of omicron mutations near cleavage sites of the spike protein. *Microorganisms*. 2022;10(10):1999. <https://doi.org/10.3390/microorganisms10101999> PMID: 36296275
22. Nie C, Sahoo AK, Netz RR, Herrmann A, Ballauff M, Haag R. Charge Matters: Mutations in Omicron variant favor binding to cells. *Chembiochem*. 2022;23(6):e202100681. <https://doi.org/10.1002/cbic.202100681> PMID: 35020256
23. Gan H, Zinno J, Piano F, Gunsalus K. Omicron spike protein has a positive electrostatic surface that promotes ACE2 recognition and antibody escape. *Front Virol*. 2022;2.
24. Kim SH, Kearns FL, Rosenfeld MA, Votapka L, Casalino L, Papanikolas M, et al. SARS-CoV-2 evolved variants optimize binding to cellular glycocalyx. *Cell Rep Phys Sci*. 2023;4(4):101346. <https://doi.org/10.1016/j.xcrp.2023.101346> PMID: 37077408
25. Pawlowski PH. Additional positive electric residues in the crucial spike glycoprotein S regions of the new SARS-CoV-2 variants. *Infect Drug Resist*. 2021;14:5099–105. <https://doi.org/10.2147/IDR.S342068> PMID: 34880635
26. Pawlowski P. SARS-CoV-2 variant Omicron (B.1.1.529) is in a rising trend of mutations increasing the positive electric charge in crucial regions of the spike protein S. *Acta Biochim Pol*. 2021;69(1):263–4. https://doi.org/10.18388/abp.2020_6072 PMID: 34905671
27. Cotten M, Phan MVT. Evolution of increased positive charge on the SARS-CoV-2 spike protein may be adaptation to human transmission. *iScience*. 2023;26(3):106230. <https://doi.org/10.1016/j.isci.2023.106230> PMID: 36845032
28. Božič A, Podgornik R. Evolutionary changes in the number of dissociable amino acids on spike proteins and nucleoproteins of SARS-CoV-2 variants. *Virus Evol*. 2023;9:vead040.
29. Božič A, Podgornik R. Changes in total charge on spike protein of SARS-CoV-2 in emerging lineages. *Bioinform Adv*. 2024;4(1):vbae053. <https://doi.org/10.1093/bioadv/vbae053> PMID: 38645718
30. Scarpa F, Imperia E, Azzena I, Giovanetti M, Benvenuto D, Locci C, et al. Genetic and structural genome-based survey reveals the low potential for epidemiological expansion of the SARS-CoV-2 XBB.1.5 sublineage. *J Infect*. 2023;86(6):596–8. <https://doi.org/10.1016/j.jinf.2023.02.039> PMID: 36863537
31. Javidpour L, Božič A, Naji A, Podgornik R. Electrostatic interactions between the SARS-CoV-2 virus and a charged electret fibre. *Soft Matter*. 2021;17(16):4296–303. <https://doi.org/10.1039/d1sm00232e> PMID: 33908595
32. Arbeitman CR, Rojas P, Ojeda-May P, Garcia ME. The SARS-CoV-2 spike protein is vulnerable to moderate electric fields. *Nat Commun*. 2021;12:5407. <https://doi.org/10.1038/s41467-021-25780-5>
33. Nie C, Pouyan P, Lauster D, Trimpert J, Kerkhoff Y, Szekeres GP, et al. Polysulfates block SARS-CoV-2 uptake through electrostatic interactions. *Angew Chem Int Ed Engl*. 2021;60(29):15870–8. <https://doi.org/10.1002/anie.202102717> PMID: 33860605
34. Zhang S, Wang N, Zhang Q, Guan R, Qu Z, Sun L. The rise of electroactive materials in face masks for preventing virus infections. *ACS Appl Mater Interfaces*. 2023.
35. Barroso da Silva FL, Giron CC, Laaksonen A. Electrostatic features for the receptor binding domain of SARS-CoV-2 wildtype and its variants. Compass to the severity of the future variants with the charge-rule. *J Phys Chem B*. 2022;126:6835–52.
36. Li L, Shi K, Gu Y, Xu Z, Shu C, et al. Spike structures, receptor binding, and immune escape of recently circulating SARS-CoV-2 Omicron BA.2.86, JN.1, EG.5, EG.5.1, and HV.1 sub-variants. *Structure*. 2024;32:1055–67.
37. O'Toole A, Hill V, Pybus O, Watts A, Bogoch I, Khan K, et al. Tracking the international spread of SARS-CoV-2 lineages B.1.1.7 and B.1.351/501Y-V2 with grinch. *Wellcome Open Res*. 2021;6:6.
38. Hatcher EL, Zhdanov SA, Bao Y, Blinkova O, Nawrocki EP, Ostapchuk Y, et al. Virus Variation Resource – improved response to emergent viral outbreaks. *Nucleic Acids Res*. 2017;45(D1):D482–90. <https://doi.org/10.1093/nar/gkw1065> PMID: 27899678
39. Hadfield J, Megill C, Bell SM, Huddleston J, Potter B, Callender C, et al. Nextstrain: real-time tracking of pathogen evolution. *Bioinformatics*. 2018;34(23):4121–3. <https://doi.org/10.1093/bioinformatics/bty407> PMID: 29790939
40. Woo P, de Groot R, Haagmans B, Lau S, Neuman B, Perlman S, et al. ICTV Virus taxonomy profile: Coronaviridae 2023. *J Gen Virol*. 2023;104:001843.

41. Nap RJ, Božič A, Szleifer I, Podgornik R. The role of solution conditions in the bacteriophage PP7 capsid charge regulation. *Biophys J*. 2014;107:1970–9.
42. Božič A, Podgornik R. pH dependence of charge multipole moments in proteins. *Biophys J*. 2017;113(7):1454–65. <https://doi.org/10.1016/j.bpj.2017.08.017> PMID: 28978439
43. Cock PJA, Antao T, Chang JT, Chapman BA, Cox CJ, Dalke A, et al. Biopython: Freely available Python tools for computational molecular biology and bioinformatics. *Bioinformatics*. 2009;25(11):1422–3. <https://doi.org/10.1093/bioinformatics/btp163> PMID: 19304878
44. Adamczyk Z, Batys P, Barbasz J. SARS-CoV-2 virion physicochemical characteristics pertinent to abiotic substrate attachment. *Curr Opin Colloid Interface Sci*. 2021;55:101466. <https://doi.org/10.1016/j.cocis.2021.101466> PMID: 34093061
45. Kucherova A, Strango S, Sukenik S, Theillard M. Computational modeling of protein conformational changes – Application to the opening SARS-CoV-2 spike. *J Comput Phys*. 2021;444:110591. <https://doi.org/10.1016/j.jcp.2021.110591> PMID: 36532662
46. Parsons RJ, Acharya P. Evolution of the SARS-CoV-2 Omicron spike. *Cell Rep*. 2023;42(12):113444. <https://doi.org/10.1016/j.celrep.2023.113444> PMID: 37979169
47. Zhang Z, Zhang J, Wang J. Surface charge changes in spike RBD mutations of SARS-CoV-2 and its variant strains alter the virus evasiveness via HSPGs: A review and mechanistic hypothesis. *Front Public Health*. 2022;10:952916. <https://doi.org/10.3389/fpubh.2022.952916> PMID: 36091499
48. Chen C, Nadeau S, Yared M, Voinov P, Xie N, Roemer C, et al. CoV-Spectrum: analysis of globally shared SARS-CoV-2 data to identify and characterize new variants. *Bioinformatics*. 2022;38(6):1735–7. <https://doi.org/10.1093/bioinformatics/btab856> PMID: 34954792
49. Taylor AL, Starr TN. Deep mutational scanning of SARS-CoV-2 Omicron BA.2.86 and epistatic emergence of the KP.3 variant. *Virus Evol*. 2024;10(1):veae067. <https://doi.org/10.1093/ve/veae067> PMID: 39310091
50. Sanchez MD, Ochoa AC, Foster TP. Development and evaluation of a host-targeted antiviral that abrogates herpes simplex virus replication through modulation of arginine-associated metabolic pathways. *Antiviral Res*. 2016;132:13–25. <https://doi.org/10.1016/j.antiviral.2016.05.009>
51. Bol S, Bunnik EM. Lysine supplementation is not effective for the prevention or treatment of feline herpesvirus 1 infection in cats: A systematic review. *BMC Vet Res*. 2015;11:284. <https://doi.org/10.1186/s12917-015-0594-3> PMID: 26573523.
52. Pedrazini MC, Martinez EF, dos Santos VAB, Groppo FC. L-arginine: Its role in human physiology, in some diseases and mainly in viral multiplication as a narrative literature review. *Futur J Pharm Sci*. 2024;10(1). <https://doi.org/10.1186/s43094-024-00673-7>
53. Maggs DJ, Collins BK, Thorne JG, Nasisse MP. Effects of L-lysine and L-arginine on in vitro replication of feline herpesvirus type-1. *Am J Vet Res*. 2000;61(12):1474–8. <https://doi.org/10.2460/ajvr.2000.61.1474> PMID: 11131583
54. Pedrazini MC, da Silva MH, Groppo FC. L-lysine: Its antagonism with L-arginine in controlling viral infection. Narrative literature review. *Br J Clin Pharmacol*. 2022;88(11):4708–23. <https://doi.org/10.1111/bcp.15444> PMID: 35723628
55. Grimes JM, Khan S, Badeaux M, Rao RM, Rowlinson SW, Carvajal RD. Arginine depletion as a therapeutic approach for patients with COVID-19. *Int J Infect Dis*. 2021;102:566–70. <https://doi.org/10.1016/j.ijid.2020.10.100> PMID: 33160064
56. Rees CA, Rostad CA, Mantus G, Anderson EJ, Chahroudi A, Jaggi P, et al. Altered amino acid profile in patients with SARS-CoV-2 infection. *Proc Natl Acad Sci U S A*. 2021;118(25):e2101708118. <https://doi.org/10.1073/pnas.2101708118> PMID: 34088793
57. Melano I, Kuo L-L, Lo Y-C, Sung P-W, Tien N, Su W-C. Effects of basic amino acids and their derivatives on SARS-CoV-2 and influenza-A virus infection. *Viruses*. 2021;13(7):1301. <https://doi.org/10.3390/v13071301> PMID: 34372507
58. Gu H, Chu DKW, Peiris M, Poon LLM. Multivariate analyses of codon usage of SARS-CoV-2 and other betacoronaviruses. *Virus Evol*. 2020;6(1):veaa032. <https://doi.org/10.1093/ve/veaa032> PMID: 32431949
59. Woo PCY, Wong BHL, Huang Y, Lau SKP, Yuen K-Y. Cytosine deamination and selection of CpG suppressed clones are the two major independent biological forces that shape codon usage bias in coronaviruses. *Virology*. 2007;369(2):431–42. <https://doi.org/10.1016/j.virol.2007.08.010> PMID: 17881030.
60. Li L, Vorobyov I, Allen TW. The different interactions of lysine and arginine side chains with lipid membranes. *J Phys Chem B*. 2013;117(40):11906–20. <https://doi.org/10.1021/jp405418y> PMID: 24007457
61. Armstrong CT, Mason PE, Anderson JLR, Dempsey CE. Arginine side chain interactions and the role of arginine as a gating charge carrier in voltage sensitive ion channels. *Sci Rep*. 2016;6:21759. <https://doi.org/10.1038/srep21759> PMID: 26899474

62. Sokalingam S, Raghunathan G, Soundarajan N, Lee S-G. A study on the effect of surface lysine to arginine mutagenesis on protein stability and structure using green fluorescent protein. *PLoS One*. 2012;7(7):e40410. <https://doi.org/10.1371/journal.pone.0040410> PMID: 22792305
63. Qing R, Hao S, Smorodina E, Jin D, Zalevsky A, Zhang S. Protein design: From the aspect of water solubility and stability. *Chem Rev*. 2022;122:14085–14179
64. Bigay J, Antonny B. Curvature, lipid packing, and electrostatics of membrane organelles: defining cellular territories in determining specificity. *Dev Cell*. 2012;23(5):886–95. <https://doi.org/10.1016/j.devcel.2012.10.009> PMID: 23153485
65. Matveeva M, Lefebvre M, Chahinian H, Yahi N, Fantini J. Host membranes as drivers of virus evolution. *Viruses*. 2023;15(9):1854. <https://doi.org/10.3390/v15091854> PMID: 37766261
66. Dinic J, Tirrell MV. Effects of charge sequence pattern and lysine-to-arginine substitution on the structural stability of bioinspired polyampholytes. *Biomacromolecules*. 2024;25(5):2838–51. <https://doi.org/10.1021/acs.biomac.4c00002> PMID: 38567844
67. Austerberry JI, Thistlethwaite A, Fisher K, Golovanov AP, Pluen A, Esfandiary R, et al. Arginine to lysine mutations increase the aggregation stability of a single-chain variable fragment through unfolded-state interactions. *Biochemistry*. 2019;58(32):3413–21. <https://doi.org/10.1021/acs.biochem.9b00367> PMID: 31314511
68. Boer J, Pan Q, Holien J, Nguyen T, Ascher D, Plebanski M. A bias of Asparagine to Lysine mutations in SARS-COV-2 outside the receptor binding domain affects protein flexibility. *Front Immunol*. 2022;13:954435.
69. Zhang L, Yu R, Wang L, Zhang Z, Lu Y, Zhou P, et al. Serial cell culture passaging in vitro led to complete attenuation and changes in the characteristic features of a virulent porcine deltacoronavirus strain. *J Virol*. 2024;98(8):e0064524. <https://doi.org/10.1128/jvi.00645-24> PMID: 39012141
70. Sallah S, Warwicker J. Computational investigation of missense somatic mutations in cancer and potential links to pH-dependence and proteostasis. *bioRxiv*; 2024. <https://doi.org/10.1101/2024.07.17.603952>
71. Warwicker J, Charonis S, Curtis RA. Lysine and arginine content of proteins: computational analysis suggests a new tool for solubility design. *Mol Pharm*. 2014;11(1):294–303. <https://doi.org/10.1021/mp4004749> PMID: 24283752
72. Levy ED, De S, Teichmann SA. Cellular crowding imposes global constraints on the chemistry and evolution of proteomes. *Proc Natl Acad Sci U S A*. 2012;109(50):20461–6. <https://doi.org/10.1073/pnas.1209312109> PMID: 23184996
73. Maristany MJ, Gonzalez AA, Espinosa JR, Huertas J, Collepardo-Guevara R, Joseph JA. Decoding phase separation of prion-like domains through data-driven scaling laws. *bioRxiv*; 2023; p. 2023–06.
74. Hebditch M, Carballo-Amador MA, Charonis S, Curtis R, Warwicker J. Protein-Sol: a web tool for predicting protein solubility from sequence. *Bioinformatics*. 2017;33(19):3098–100. <https://doi.org/10.1093/bioinformatics/btx345> PMID: 28575391
75. Wang H, Feng L, Webb GI, Kurgan L, Song J, Lin D. Critical evaluation of bioinformatics tools for the prediction of protein crystallization propensity. *Brief Bioinform*. 2018;19(5):838–52. <https://doi.org/10.1093/bib/bbx018> PMID: 28334201
76. Azevedo C, Saiardi A. Why always lysine? The ongoing tale of one of the most modified amino acids. *Adv Biol Regul*. 2016;60:144–50. <https://doi.org/10.1016/j.jbior.2015.09.008> PMID: 26482291
77. Loboda AP, Soond SM, Piacentini M, Barlev NA. Lysine-specific post-translational modifications of proteins in the life cycle of viruses. *Cell Cycle*. 2019;18(17):1995–2005. <https://doi.org/10.1080/15384101.2019.1639305> PMID: 31291816
78. Zhang H, Zheng H, Zhu J, Dong Q, Wang J, Fan H, et al. Ubiquitin-modified proteome of SARS-CoV-2-infected host cells reveals insights into virus-host interaction and pathogenesis. *J Proteome Res*. 2021;20(5):2224–39. <https://doi.org/10.1021/acs.jproteome.0c00758> PMID: 33666082
79. Okada AK, Teranishi K, Ambroso MR, Isas JM, Vazquez-Sarandeses E, Lee J-Y, et al. Lysine acetylation regulates the interaction between proteins and membranes. *Nat Commun*. 2021;12(1):6466. <https://doi.org/10.1038/s41467-021-26657-2> PMID: 34753925
80. Li F. Structure, function, and evolution of coronavirus spike proteins. *Annu Rev Virol*. 2016;3(1):237–61. <https://doi.org/10.1146/annurev-virology-110615-042301> PMID: 27578435
81. Ali I, Conrad RJ, Verdin E, Ott M. Lysine acetylation goes global: From epigenetics to metabolism and therapeutics. *Chem Rev*. 2018;118(3):1216–52. <https://doi.org/10.1021/acs.chemrev.7b00181> PMID: 29405707
82. Pinto SM, Subbannayya Y, Kim H, Hagen L, Górna MW, Nieminen AI, et al. Multi-OMICs landscape of SARS-CoV-2-induced host responses in human lung epithelial cells. *iScience*. 2023;26(1):105895. <https://doi.org/10.1016/j.isci.2022.105895> PMID: 36590899

83. Murray LA, Sheng X, Cristea IM. Orchestration of protein acetylation as a toggle for cellular defense and virus replication. *Nat Commun.* 2018;9(1):4967. <https://doi.org/10.1038/s41467-018-07179-w> PMID: 30470744
84. Nakayasu ES, Burnet MC, Walukiewicz HE, Wilkins CS, Shukla AK, Brooks S, et al. Ancient regulatory role of lysine acetylation in central metabolism. *mBio.* 2017;8(6):e01894-17. <https://doi.org/10.1128/mBio.01894-17> PMID: 29184018
85. Liang B, Zhu Y, Shi W, Ni C, Tan B, Tang S. SARS-CoV-2 spike protein post-translational modification landscape and its impact on protein structure and function via computational prediction. *Research (Wash D C).* 2023;6:0078. <https://doi.org/10.34133/research.0078> PMID: 36930770
86. Guccione E, Richard S. The regulation, functions and clinical relevance of arginine methylation. *Nat Rev Mol Cell Biol.* 2019;20(10):642–57. <https://doi.org/10.1038/s41580-019-0155-x> PMID: 31350521
87. Cheng N, Liu M, Li W, Sun B, Liu D, Wang G, et al. Protein post-translational modification in SARS-CoV-2 and host interaction. *Front Immunol.* 2023;13:1068449. <https://doi.org/10.3389/fimmu.2022.1068449> PMID: 36713387
88. Weiss RA. Virulence and pathogenesis. *Trends Microbiol.* 2002;10(7):314–7. [https://doi.org/10.1016/s0966-842x\(02\)02391-0](https://doi.org/10.1016/s0966-842x(02)02391-0) PMID: 12110209
89. Holmes EC. The emergence and evolution of SARS-CoV-2. *Annu Rev Virol.* 2024;11.
90. Lee B, Quadeer AA, Sohail MS, Finney E, Ahmed SF, McKay MR, et al. Inferring effects of mutations on SARS-CoV-2 transmission from genomic surveillance data. *Nat Commun.* 2025;16(1):441. <https://doi.org/10.1038/s41467-024-55593-0> PMID: 39774959
91. Bonneaud C, Tardy L, Hill GE, McGraw KJ, Wilson AJ, Giraudeau M. Experimental evidence for stabilizing selection on virulence in a bacterial pathogen. *Evol Lett.* 2020;4(6):491–501. <https://doi.org/10.1002/evl3.203> PMID: 33312685
92. Jackson CB, Farzan M, Chen B, Choe H. Mechanisms of SARS-CoV-2 entry into cells. *Nat Rev Mol Cell Biol.* 2022;23(1):3–20. <https://doi.org/10.1038/s41580-021-00418-x> PMID: 34611326