ABSTRACT: Membrane proteins and lipids have the capacity to associate into lateral domains in cell membranes through mutual or collective interactions. Lipid rafts are functional lateral domains that are formed through collective interactions of certain lipids and which can include or exclude proteins. These domains have been implicated in cell signaling and protein trafficking and seem to be of importance for virus–host interactions. We therefore want to investigate if raft and viral membrane proteins present similar structural features, and how these features are distributed throughout viruses. For this purpose, we performed a bioinformatics analysis of raft and viral membrane proteins from available online databases and compared them to nonraft proteins. In general, transmembrane proteins of rafts and viruses had higher proportions of palmitoyl and phosphoryl residues compared to nonraft proteins. They differed in terms of transmembrane domain length and thickness, with viral proteins being generally shorter and having a smaller accessible surface area per residue. Nontransmembrane raft proteins had increased amounts of palmitoyl, prenyl, and phosphoryl moieties while their viral counterparts were largely myristoylated and phosphorylated. Several of these structural determinants such as phosphorylation are new to the raft field and are extensively discussed in terms of raft functionality and phase separation. Surprisingly, the proportion of palmitoylated viral transmembrane proteins was inversely correlated to the virus size which indicated the implication of palmitoylation in virus membrane curvature and possibly budding. The current results provide new insights into the raft–virus interplay and unveil possible targets for antiviral compounds.

INTRODUCTION

Cell membrane lipids and proteins present a large degree of spatial heterogeneity in the lateral plane.1−5 The formation of lateral domains facilitates or hinders interactions between membrane components guiding signal transduction6 and intraorganellar transport,7,8 among other cellular functions. Some types of membrane domains are formed mainly from collective lipid interactions as is the case for lipid membrane rafts.9,10 In rafts, favorable interactions between cholesterol, sphingolipids, saturated acyl chains, glycolipids, and also membrane proteins drive the formation of transient domains involved in signaling, as well as lipid and protein transport.9

Curiously, some types of viruses have been linked to raft formation as they require cholesterol, sphingomyelin and membrane lipid heterogeneity for fusion with the cell membrane.11 Influenza and coronavirus association and binding to host cells is facilitated by raft formation,12,13 while some viruses such as human immunodeficiency viruses (HIV) assemble into raft domains before maturation and budding.14−22 The importance of lipid rafts for viral assembly is further underlined by the fact that viral lipidomes are essentially composed of raft lipids.23,24 Furthermore, it seems that raft localization of certain viral proteins is essential for membrane dependent viral assembly, budding, and fusion.17,18,22,25,26

In light of these implications for rafts in cellular and viral functions, it is essential to know which structural parameters are typical for proteins in raft domains and if these are similar in viral proteins. It has been shown that certain lipid modifications, and structural parameters of transmembrane domains (TMDs) play important roles in raft partitioning of proteins.27−29 A predictive model for raft partitioning for single-pass transmembrane domains was created from energy
contributions of palmitoyl residues, hydrophobic matching, and TMD/membrane interfacial energy. This model is not applicable for multipass transmembrane domains or membrane attached (peripheral) proteins and also ignores other possible structural properties, capable of interacting with membranes and raft domains. These knowledge gaps on structural information are aggravated by contradictory results on some protein modifications such as prenylations, which have been listed as raft preferring or raft avoiding.

We therefore use a bioinformatics approach to compare various structural properties of raft, viral, and nonraft membrane proteins which are based on large available data sets. This approach should allow us to gather statistical relevant data and determine the importance of structural properties for raft partitioning and examine the occurrence of those in viral proteins. We especially focus on post-translational modifications which have been shown to influence raft partitioning in the past and investigate new parameters such as phosphorylations, disulfide bonds, and glycosylations, which could potentially influence raft localization.

Besides the relevance of structural information for raft partitioning, we will investigate if these structural properties are conserved in different viral families and if they are involved in the generation of membrane curvature during the maturation process. The reason for this assumption is the fact that palmitoylated proteins were able to regulate curvature in influenza viruses. We therefore explore if virus size or curvature can be linked to the explored structural parameters and their variability upon viral families.

## METHODS

### Data Mining

To build a raft protein database, we combine human raft proteins from the Swiss-prot server, and those from the RaftProt 2.0 database in which raft partitioning has been determined by at least 2 different methods. We further create a second group of nonraft proteins, including all human membrane proteins from the Swiss-prot database which are not in the established raft database. A third group contains all human viral membrane proteins in the Swiss-Prot database. Those three membrane protein groups are further split upon plasma membrane (PM) or endomembrane (EM) localization in the UniProt/Swiss-Prot database. Endomembranes are defined here as all internal membranes except mitochondria. This approach takes into account the fact that proteins possess some structural organelar identity, rendering comparison of raft versus nonraft proteins from different organelles difficult.
Proteins are further grouped into single-pass, multipass, and membrane attached (peripheral) proteins because they interact quite differently with membranes. To avoid irrelevant structural information we only take peer reviewed proteins into account. The exact number of proteins in each group is shown in (Figure 1B).

Figure 2. Schematic of structural determinants and associated formula to predict the free energy ($\Delta G_{\text{raft, pred}}$) of raft partitioning according to Lorent el al.29 (A, left). Predictions have been made for single-pass transmembrane proteins in the nonraft, raft and viral database upon cellular localization (A, right). Membrane protein fractions ($F$) ± SEM containing structural modifications in the nonraft (full bars), raft (striped bars), and viral protein (squared bars) database upon localization in endomembranes (purple color) or the plasma membrane (orange color) (B–D). In addition, TMD length and accessible surface area/residue ($\text{ASA}_{\text{res}}$) are determined for transmembrane proteins (B, C). Proteins are grouped upon single-pass transmembrane (B), multipass transmembrane (C), and membrane attached proteins (D). A two-way ANOVA test has been performed to compare the raft and viral proteins versus non raft data sets (*$p < 0.05$, **$p < 0.01$, ***$p < 0.001$, ****$p < 0.0001$).

Analysis of Structural Parameters. For all subgroups, we analyze various structural parameters which could be relevant for raft partitioning (Figure 1C).27,29 We are mainly interested in post-translational lipid modifications of membrane proteins such as prenylation, myristoylation, palmitoylation, and GPI-anchors since they have previously shown to be involved in raft localization of membrane proteins.27 We further investigate
Figure 3. Distributions of the amount of modifications per protein (N_x/protein) shown as violin shaped plots. The straight black line reflects the median of the distribution and the dotted lines the quartiles. The number on top of the violin plot is the average number of modifications per protein including the statistical difference of a one-way ANOVA versus the nonraft phase (**p < 0.01, ***p < 0.001, ****p < 0.0001). Plots are given for single-pass (A), multipass (B), and attached membrane proteins (C) in endomembranes (purple) and cell membranes (orange) for nonraft, raft, and viral proteins.
other post-translational modifications which could potentially influence raft partitioning. Glycosylation was analyzed since it may influence raft partitioning through hydrogen bonding with glycolipids or other glycoproteins. Disulfide bonds and phosphorylation are also investigated since they can induce oligomerization of proteins which might help in raft assembly or partitioning to preformed domains. The presence of all post-translational modifications in proteins is determined via the correspondent annotations in the Swiss-Prot/UniProtKB database. In detail, we count the numbers of modified proteins in each group which is determined as fraction of, i.e., prenylated proteins (Figures 2). The number of modifications per proteins (Figure 3) is determined according to annotations in the Swiss-Prot databank. These can be either published modifications, predicted modifications by certain algorithms (unirule, prosite − prule), or manual assertions according to sequence analysis and similarity.

Prediction of Raft-Partitioning of Single-Pass Transmembrane Proteins. For transmembrane proteins, we additionally calculate transmembrane domain (TMD) length, TMD accessible surface area per residue (ASAres), and the free energy of raft partitioning (ΔGraft,pred) as predicted for single-pass transmembrane proteins. Briefly, the transmembrane domain for single pass transmembrane proteins is determined from annotations in the Uniprot database which is mainly based on predictions by the TMHMM algorithm. We further multiply the number of amino acids in a TMD by 0.15 nm which is the statistical length of a residue in an α-helix. For multipass transmembrane domains, the TMD length is considered as the mean of all individual TMD lengths. The accessible surface area per residue in a TMD (ASAres) was determined by summing up ASA values for all individual residues in TMDs as described by Yuan and further normalizing to the length of the TMD.

The free energy of raft partitioning (ΔGraft,pred), which gives an indication on how the protein would preferentially partition into the raft phase in giant plasma membrane vesicles (GPMVs) is predicted by the formula in Figure 2A for single pass transmembrane proteins. The three individual terms arise from the difference of interfacial energy between the protein in the raft and nonraft phase (ΔyTMD,Lo−d,Ld = 1.1 pN/nm), the free energy contribution from palmitoyl residues (ΔGpalm=−0.48 kcal/mol per palmitoyl residue) and the free energy arising from hydrophobic matching as described in the mattress model (−2βLp(dTMD − 0.5(dlα + ddL)) in which βLp = 7.5 × 10−2 kcal/mol·nm, dlα = 3.9 nm, and ddL = 3.6 nm.

Structural Parameters upon Viral Families. We further investigate if post-translational modifications including TMD length and accessible surface area are similarly distributed in single-pass transmembrane proteins of different enveloped viruses in the host plasma membrane. To do so, we study the coefficient of variation of given structural parameters upon viral families (Table 1). We also cross-correlate the fractions of proteins containing certain modifications with each other upon different virus families. This allows us to investigate if structural properties might develop in parallel (Figure 6). For example, the fraction of palmitoylated proteins might increase in parallel with the TMD length and decrease with the accessible surface area from one species to the other because proteins of certain viral species prefer to partition into lipid rafts. We include into these correlations membrane curvature or virus size because palmitoylation has recently been linked to membrane curvature in HIV which might result from the participation of palmitoylation in virus budding.

| species          | MVS (L.L-U.L.) in nm | Fpalmoylate | FProt | Fglycosylation | Fpalmitoyl | length (nm) | ASAres (Å²) | Nprot |
|------------------|----------------------|-------------|-------|----------------|------------|-------------|-------------|-------|
| Coronaviridae    | 140 (120–160)        | 0.54        | 0.00  | 1.00           | 1.00       | 3.15        | 36.38       | 24    |
| Flaviviridae     | 47.5 (45–50)         | 0.97        | 1.00  | 0.88           | 0.84       | 3.15        | 30.61       | 33    |
| Herpesviridae    | 230 (160–300)        | 0.00        | 0.24  | 0.90           | 0.48       | 3.13        | 30.43       | 82    |
| Orthomyxoviridae | 100 (80–120)         | 0.50        | 0.23  | 0.93           | 0.96       | 3.19        | 30.15       | 139   |
| Paramyxoviridae  | 225 (150–300)        | 0.10        | 0.00  | 0.98           | 0.48       | 3.16        | 32.07       | 61    |
| Retroviridae     | 105 (90–120)         | 0.72        | 0.01  | 1.00           | 0.98       | 3.15        | 32.56       | 103   |
| Togaviridae      | 70 (70–70)           | 1.00        | 0.38  | 1.00           | 1.00       | 3.13        | 27.33       | 32    |
| C.V. (%)         | 54.9                 | 71.4        | 134.0 | 4.20           | 29.3       | 0.6         | 8.9         |       |

“C.V. (%)” was calculated from several sources and is displayed with lower (L.L.) and upper limits (U.L.).

| species          | MVS (L.L-U.L.) in nm | Fpalmoylate | FProt | Fglycosylation | Fpalmitoyl | length (nm) | ASAres (Å²) | Nprot |
|------------------|----------------------|-------------|-------|----------------|------------|-------------|-------------|-------|
| Paramyxoviridae  | 120 (100–140)        | 0.50        | 0.23  | 0.93           | 0.96       | 3.19        | 30.15       | 139   |
| Retroviridae     | 100 (80–120)         | 0.72        | 0.01  | 1.00           | 0.98       | 3.15        | 32.56       | 103   |
| Togaviridae      | 70 (70–70)           | 1.00        | 0.38  | 1.00           | 1.00       | 3.13        | 27.33       | 32    |
| C.V. (%)         | 54.9                 | 71.4        | 134.0 | 4.20           | 29.3       | 0.6         | 8.9         |       |

“C.V. (%)” was calculated from several sources and is displayed with lower (L.L.) and upper limits (U.L.).
TMD\textsubscript{length}) but no significant difference in accessible surface area per TMD residue (Figure 2B, ASA/residue). The absence of difference in ASA was surprising because proteins with low ASA would prefer the raft phase. Those results are later discussed.

Besides the “classic” protein modifications involved in raft partitioning (see above and Methods), we also investigated protein glycosylations, phosphorylations, and disulfide bonds. Glycosyl residues of proteins can potentially interact through hydrogen bonds or other polar interactions with glycosphingolipids, which are largely enriched in lipid rafts.\textsuperscript{41,42} Unexpectedly, there was either a decrease of glycosylated proteins in endomembrane raft versus nonraft proteins or no significant change in both plasma membrane groups (Figures 2B and 3A). This might indicate that glycosyl residues do not contribute to raft partitioning in single-pass transmembrane proteins. Protein phosphorylation is a post-translational modification which is essential in signal transduction and protein-induced phase separation. Phosphorylation of multiple protein residues can lead to the formation of protein phase separation or aggregation at the inner cell membrane interface as shown for phosphorylation of Linker for activation of T-cells (LAT).\textsuperscript{5,6} It had not been clear yet if protein phase separation is linked to raft formation but we observed a large increase in the fraction of proteins being phosphorylated (Figure 2B, $F_{\text{phosphorylation}}$) and the number of phosphorylation sites in annotated raft proteins compared to nonrafts (Figure 3A, $N_{\text{phosphoryl/protein}}$). This might hint at the importance of phosphorylation for raft formation, stabilization, or raft functionality, since protein phosphorylation events are important for signal transmission. Intermolecular disulfide bonds could potentially enhance or stabilize a raft phase by forming homo- or hetero-oligomers. However, while the fraction of proteins with disulfide bonds in the raft phase did not increase (Figure 2B), the average number of disulfide bonds/protein increased (Figure 3A). These results indicate that only a small number of proteins in the raft database possesses higher amounts of disulfide bonds compared to nonraft proteins.

Multipass transmembrane proteins interact differently with the membrane because their individual transmembrane domains interact closely with each other and thereby exclude protein–lipid interactions on a large scale. It makes sense that they do not exactly follow the same trends as single-pass transmembrane proteins, but we similarly observed an increase in fractions of palmitoylated and phosphorylated proteins and numbers of those modifications in plasma membrane raft proteins (Figures 2C and 3B). TMD length, glycosylations, and disulfide bonds were reduced in plasma membrane raft proteins and there were no obvious changes observed for endomembrane proteins. Other lipid modifications like myristoylations or prenylations were only present in infinitesimal amounts and were therefore not considered important for raft partitioning of transmembrane proteins.

Membrane-attached proteins (Figures 2D and 3C) were distinct in that they possessed other lipid modifications than transmembrane proteins. We observed a general increase of prenylated proteins in the raft database, while the fraction of palmitoylated and GPI-modified proteins increased only in raft proteins of the plasma membrane. Curiously, prenylations have been considered nonraft signals because of their rather bulky nature, and their presence here is rather surprising considering that the raft phase is tightly packed.\textsuperscript{31,45} GPI-anchors have always been considered raft signals, and the present result concurs with previous findings.\textsuperscript{32,42−44} Regarding nonlipid modifications, we observed once more an increase of phosphorylated proteins in raft proteins of the plasma membrane, emphasizing the importance of phosphorylations for raft proteins.

**Structural Properties of Proteins from the Virus Database.** As we have shown, single-pass transmembrane viral proteins localized at the host cell membrane were predicted to partition into the raft phase compared to nonraft proteins (Figure 2A, $\Delta G_{\text{raft,pred}}$). This seems to be largely due to the great amount of palmitoyl residues (0.97 palmitoyl residues/protein) compared to only 0.05 palmitoyl residues/protein in nonraft proteins (Figure 3A, orange violin plots). Multipass transmembrane proteins in viruses were roughly 60% being palmitoylated (Figure 2B) which corresponded to 1.3 palmitoyl residues/protein compared to 0.1 palmitoyl residues/protein in the nonraft phase (Figure 3B). Interestingly, transmembrane viral proteins had largely higher amounts of palmitoyl residues than proteins from the raft database (Figure 2 and 3). This means either that viral proteins partition extremely well into the raft phase, which would correspond to the low predicted free energy of raft partitioning ($\Delta G_{\text{raft,pred}}$) (Figure 1A), or that palmitoylation has additional functions in viral proteins. Regarding transmembrane domain properties, it seems that viral multipass TMDs were generally shorter, which is counterintuitive if we assume that viral TMDs have to “match” the thicker raft phase. The ASA\textsubscript{m} decreased in virus proteins except for single pass TMDs in endomembranes. The fraction of glycosylated transmembrane proteins was overall high (85−95%) in nonraft, raft, and viral proteins of the cell membrane (Figure 2B,C, purple color). Remarkably, the number of glycosylations per protein jumped from 5 to 6 in nonraft and raft, respectively, to 10 in viral single pass proteins. In multipass proteins, the numbers increased from 2 to 3 glycosyls/protein to 6. Glycosylation has a functional role in virus proteins since it can prevent recognition by the immune system.\textsuperscript{45,46} This might explain the higher number of glycosyl residues in virus encoded proteins and might hence be unrelated to the formation of a raft or raft-like phase. The fraction of phosphorylated proteins and the number of phosphoryl residues/protein increased significantly in plasma membrane multipass transmembrane virus proteins compared to nonraft proteins. Although the number was lower than in raft proteins and seemed to be of less importance in single pass transmembrane proteins or endomembrane proteins. Disulfide bonds presented an hourglass shape distribution (bimodal) in viral plasma membrane transmembrane proteins. The proportion of disulfide bonds was also higher in the plasma membrane compared to the endomembrane system. It might be that several viruses combine plasma membrane specific signals with raft signals.

Membrane-attached viral proteins varied only slightly for palmitoylation but around half of their proteins were myristoylated compared to 4–5% of nonviral proteins (Figure 2D). The distribution of myristoyl residues revealed that about half of the proteins contained 1 myristoyl residue/protein while the other half contained none (Figure 3C). The role of myristoylation for raft partitioning in literature is not clear and it seems that a single myristoyl residue is not enough for raft partitioning.\textsuperscript{27} We did not observe a clear increase for this lipid modification in the raft database, so it seems that this modification is typical for viral proteins. There was no change
observed for prenylations and GPI-anchors conversely to the raft database. Regarding nonlipid modifications, an increase of phosphorylated proteins was again observed while the numbers of phosphoryl residues remained low compared to nonraft proteins. Glycosylations and disulfide bonds were almost absent in this protein group, maybe because of their preferred localization on the inner membrane leaflet.

**Principal Component Analysis of Proteins Reveals the Most Important Structural Determinants.** To gain a clearer picture of significant modifications in nonraft, raft, and

![Figure 4](https://dx.doi.org/10.1021/acs.jpcb.0c03435)
viral proteins, we performed a principal component analysis (PCA) upon the average number of modifications per protein (Figure 4). After analysis, we regrouped proteins either upon nonraft, raft, and viral proteins (Figure 4, left column) or upon cellular localization (Figure 4, right column). This should enable us to distinguish between raft and virus or localization dependent properties, respectively. We combined single and multipass transmembrane proteins in the analysis to determine common properties for all transmembrane proteins in the three databases (Figure 4A–D). A first PCA of nonraft versus raft transmembrane proteins revealed that the chosen structural properties partially overlapped (Figure 4A), although a certain trend appeared. A smooth transition from nonraft to raft proteins had been observed in GPMVs in which many proteins presented an intermediate raft partitioning coefficient.29 We can therefore assume that many proteins are able to partition in between raft and nonraft phases which makes it more complicated to find strict raft determining parameters. However, palmitoylation and phosphorylation contributed most to the distinction between raft and nonraft proteins.

Similar conclusions could be drawn from a PCA of the fraction of palmitoylated proteins (Figure S1A).

Interestingly, the same PCA can better explain differences between plasma membrane and endomembrane proteins since both groups only slightly overlap (Figures 4B and S1B). The most important parameters to explain the differences seem again to be palmitoylation and phosphorylation. It appears though that raft partitioning follows similar structural rules as plasma membrane localization, but that the difference between protein structures is somehow larger (Figure 4A,B).

The chosen structural parameters can also not completely explain differences between transmembrane viral and nonviral proteins (Figures 4C and S1C). Differences between viral and nonviral transmembrane proteins were best explained by an increased amount of palmitoylations and glycosylations, and to a lesser extent by disulfide bonds and phosphorylations (Figure 4C). Although it seemed that a higher percentage of proteins had disulfide bonds even if the number of modifications was less important (Figures 2, 3, and S1). Plasma membrane localization of viral proteins depended on similar parameters

Figure 5. Schematic of typical modifications in raft and viral plasma membrane proteins (A). Examples of typical nonraft, raft, and viral plasma membrane proteins with numbers of structural modifications (B).
but differences between both groups seemed to be less important (Figure 4D). Membrane attached proteins showed different properties for raft, nonraft, and viral proteins (Figure 4E). While raft proteins displayed higher amounts of phosphorylation, palmitoylation, glycosylation, and prenylations compared to nonraft proteins, viral proteins were rather myristoylated. These differences were rather striking and created different clusters. Interestingly, if the PCA was performed on the fraction of proteins possessing a certain modification, phosphorylation was also a defining factor for viral proteins (Figure S1) which is expected from (Figure 2D). Cell membrane localization of attached membrane proteins was best explained by glycosylation, GPI-anchors and disulfide bonds (Figures 4F and S1F). Those modifications are expected of peripheral plasma membrane proteins present on the exoplasmic leaflet.

We graphically summarized the decisive structural peculiarities which distinguished raft and viral proteins from nonraft proteins (Figure 5A) and gave some examples of common proteins with typical modifications for each class (Figure 5B). **Variability and Correlation of Structural Parameters in Viruses.** Since viral proteins presented peculiar structural parameters compared to nonraft and raft proteins (Figure 5), we wanted to investigate the interspecies variability of those parameters. To avoid localization dependent biases, we only analyzed single-pass transmembrane proteins of the host plasma membrane (Table 1). Variations were very high in the fractions of palmitoylated and phosphorylated proteins (>70%) contrarily to other parameters in which variability remained relatively low (<30%).

Next, we created a correlation matrix to determine if different properties are inherently correlated between viral families (Figure 6A and Table S1). Astonishingly, we found that the mean virus size (MVS) is negatively correlated to the fraction of palmitoylated proteins (Figure 6A,B). Very small viruses (around 100%) while in larger viruses the amount of curvature and phosphorylations can induce the formation of a large protein-raft phase implicated in signal transduction or protein trafficking. Another explanation for the high presence of phosphorylations might be their implication in signaling. Protein signaling is often regulated through the presence of

**DISCUSSION**

The analyzed structural parameters for protein partitioning into raft domains differed upon their cellular localization and protein type (single, multiple, and attached membrane proteins). Interestingly, the most important features to discern nonraft from raft proteins were palmitoylation and phosphorylation while prenylation was also a determinant for raft partitioning of attached membrane proteins (Figure 4). Palmitoylation has been shown to be of importance for raft partitioning in numerous models in accordance with the analyzed proteins from the raft database. Prenylation is supposed to be a decreasing factor for raft partitioning, and its higher presence in the raft database is rather surprising since it is difficult to imagine very bulky isoprenyl tails inserting into the very packed raft environment. Some authors proposed that isoprenyls are found on the interface between raft and nonraft phase which might explain differing results since partitioning might depend on the detergent resistant membrane (DRM) isolation methods used.

The observed presence of phosphorylation residues is to our knowledge an unknown raft directing factor but has been associated with raft partitioning. Multiple protein phosphorylations can induce the formation of a large protein phase separation at the cytosolic membrane interface as it has been shown for LAT. LAT has also been shown to be associated with the raft phase independently of phosphorylation sites in GPMVs, which means that phosphorylation is most probably not a prerequisite for raft association but maybe a functional aspect or stabilizing factor for rafts. Raft association of phosphorylable proteins could lead to their close association, and further phosphorylation could lead to a large protein-raft phase implicated in signal transduction or protein trafficking. Another explanation for the high presence of phosphorylations might be their implication in signaling.

![Figure 6](https://dx.doi.org/10.1021/acs.jpcb.0c03435)

**Figure 6.** Correlation matrix (Pearson coefficient) of viral single-pass transmembrane protein properties with correspondent significance. *p < 0.05, ***p < 0.001 (A); Virus size or curvature is strongly correlated to the fraction of palmitoylated proteins (B).
phosphorylated residues by kinases and phosphatases. Since rafts are signaling domains, the increased presence of phosphorylated proteins would reflect their functional aspect.

Parameters such as transmembrane domain length and accessible surface area were important for raft partitioning of single pass transmembrane proteins in GPMVs. Single-pass transmembrane proteins from the raft database were also longer but had an increased surface area per residue. Multipass transmembrane domains were surprisingly shorter in the raft database but plasma membrane proteins were generally longer than endomembrane proteins. The differences from experimental GPMV data and the raft database might arise from the fact that the RaftProt 2.0 database is 86% based on DRM experiments.53 DRMs suffer from several artifacts such as the induction of a raft phase by the detergent itself.57 This might favor effects from lipid modifications over transmembrane domains since the detergent might intercalate in between the lipids and the transmembrane domain and hence reduce effects due to interfacial tension (Figure 2A). The results concerning TMD-length and TMD accessible surface area are therefore to be interpreted cautiously.

We suspected virus proteins to be similar to raft proteins because many papers published the importance for rafts in virus binding and assembly in the host cell.12,14,15,17,20,21,23,24 Virus transmembrane proteins were, like raft proteins, mainly enriched in palmitoyl residues and phosphorylation sites, but they presented more glycosylations and had a slightly shorter and thinner TMD (lower ASA). Attached viral proteins presented higher proportions of myristoyl residues compared to high amounts of palmitoylation and prenylation sites in raft proteins. An increase of phosphorylation sites seemed also to be a common structural feature of nontransmembrane viral proteins (Figure 4).

Palmitoylation was a common feature of raft and viral proteins, but the average amount of palmitoylated proteins was much higher in viruses compared to the raft database. A large interspecies variation in the proportion of palmitoylated virus proteins could specifically be related to the virus size. A high amount of palmitoylated proteins in a certain species reflected a small virus size and vice versa (Figure 5). This result revealed that palmitoyl residues in viruses might not only be involved in raft association but also in the induction of curvature. It was shown that palmitoyl residues are able to increase the negative curvature of the inner leaflet and hence induce the formation of smaller virus-like particles.32 Palmitoylation might therefore fulfill a double function in viral proteins which is raft association and the induction of negative curvature during budding. The very low amount of palmitoylated proteins (almost 0) in certain viruses further suggests that their proteins most probably do not associate with lipid rafts. Interestingly, some viruses are able to change the amount of palmitoylation and myristoylation in the host cells, which could also potentially change raft partitioning of host proteins.59 Inhibition of palmitoylation could therefore be a very interesting antiviral drug target. The increase of phosphorylation in viral proteins could be related to their functional aspects. Viruses are able to produce their own kinases but also recruit host kinases for proliferation which makes them interesting targets for antiviral therapy.60,61 It is not clear to what extend phosphorylation in viruses is involved in raft partitioning or protein phase separation, but it is definitely worth further experimental investigation.60 The reduction in length and thickness of TMDs in viral transmembrane proteins could biophysically reflect a thinner and more tightly packed membrane, respectively.29,38 Alternatively, TMD length seems to be related to the viral entry mechanism, and it is usually higher for proteins which enter through the plasma membrane but shorter for proteins, which are guided through endocytosis.62 Protein myristoylation was increased in viral attached proteins but not in raft proteins. It is not clear if myristoyl residues would contribute to raft association since the literature on myristoylation is controversial.27,40 Biophysically, the C14 myristoyl tail should be easier to integrate into a thinner membrane compared to the longer C16 palmitoyl tail. However, myristoylation of viral proteins seems to be an interesting drug target as it was shown for HIV.63 The high amount of glycosylation in viral proteins has been discussed above, and it remains unclear if glycosylation is a raft-dependent structural parameter.8,64,65

Recently, a mechanism that describes raft-dependent association of HIV proteins fits very well with our observations.32 In their model, virus and raft proteins assemble first through a raft-dependent mechanism. Later, the raft domains increase in curvature and bud out of the membrane.22 With respect to our data, the higher proportion of palmitoyl residues, the lower accessible surface area of TMDs, and increased amounts of myristoylated-attached proteins could first drive raft partitioning of virus proteins.29 Furthermore, multiple phosphorylations might guide protein assembly at the membrane or induce signaling,66 and high amounts of palmitoylated transmembrane proteins could help increase the curvature of domains.32 A high curvature could further favor assembly of curved raft-like lipids into the final virion, which has previously been observed.33,24

# SUMMARY/CONCLUSION

From the current data, it emerges that raft and virus membrane proteins have similar and differentiating features in terms of studied modifications and TMD properties. On average, virus and raft transmembrane proteins were enriched in palmitoylated and phosphorylated residues, but the amounts were very variable upon viral species. While palmitoylation is a known feature for raft partitioning, phosphorylation is new and could either be related to raft functionality and signaling, to protein phase separation and the stabilization of a raft phase, or both. Palmitoylation and disulfide bonds could be correlated to virus size, indicating that they are possible drivers of membrane curvature. Membrane-attached raft proteins were similarly enriched in palmitoyl and phosphoryl residues but surprisingly possessed isoprenyl residues that had been labeled as nonraft signals in the past. Attached viral proteins possessed shorter myristoyl residues and phosphorylation was higher in terms of protein fraction. We have to keep in mind that most of the analyzed raft data were based on DRM experiments which have their caveats, and further experimental data are certainly necessary to confirm these features in terms of raft partitioning and curvature. However, other structural features which might influence raft partitioning or curvature but were not analyzed in this study should also not be dismissed, i.e., the formation of dimers and oligomers.67

# ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jpcb.0c03435.
Principal component analysis and correlation matrix of viral protein modifications (PDF)

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Notes

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