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Perspective on taxonomic classification of uncultivated viruses

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Historically, virus taxonomy has been limited to describing viruses that were readily cultivated in the laboratory or emerging in natural biomes. Metagenomic analyses, single-particle sequencing, and database mining efforts have yielded new sequence data on an astounding number of previously unknown viruses. As metagenomes are relatively free of biases, these data provide an unprecedented insight into the vastness of the virosphere, but to properly value the extent of this diversity it is critical that the viruses are taxonomically classified. Inclusion of uncultivated viruses has already improved the process as well as the understanding of the taxa, viruses, and their evolutionary relationships. The continuous development and testing of computational tools will be required to maintain a dynamic virus taxonomy that can accommodate the new discoveries.

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Introduction

Few viruses are readily cultivated under laboratory conditions and even fewer cause noticeable outbreaks of disease. Over a century of virus research has resulted in an extremely biased view of global virus diversity and a limited, patchy, and non-systematic picture of the taxonomy of viruses, but viral metagenomic datasets can illuminate the true extent of the virosphere. Specifically, when previously described viral genome sequences are included in a clustering analysis together with the viral sequences obtained from metagenomics, the known sequences tend to fall within a limited subset of the clusters [1–6]. In less than a decade, the analysis of genomic sequences of uncultivated viruses, mostly derived from metagenomes, has led to a surge in virus discovery, providing invaluable new data with limited

bias for the identification and characterization of viruses. For cellular organisms (such as *Bacteria*, *Archaea*, and microbial eukaryotes), a vast expansion in the number of available genome sequences and updated analytics enabled a systematic genome-based classification that has had a profound impact on taxonomy [7[•],8,9]. Techniques for cultivation-independent discovery of viruses, including metagenomic analysis and single-particle sequencing, as well as database mining efforts have contributed sequence data for hundreds of thousands of previously unknown viruses [2,10–14], with advances in overall virus taxonomy following closely behind [15,16[•],17]. As genome sequences of uncultivated viruses provide new detailed information about the complex virosphere, the International Committee on Taxonomy of Viruses (ICTV) has the challenge of robustly classifying this unprecedented diversity. The ICTV has started addressing this challenge through several important amendments to policy. First, genomic characteristics are now acknowledged as the fundamental component of taxonomic classification [17], facilitating the alignment of taxonomy with the evolutionary events from which viral lineages emerged. Second, distant relationships can now be formalized using the recently introduced 15 hierarchical ranks [16[•]]. Although virus taxonomy will always remain dynamic to accommodate newly discovered viral lineages and adjust to advancing insights, inclusion of uncultivated viruses has already improved the accuracy and depth of the depicted evolutionary relationships of taxa and our understanding of the viruses they represent, as illustrated with several examples below [18–20]. Herein, the Bioinformatics Expert Group (BEG) of the ICTV provides a perspective on the lessons learned and remaining challenges for taxonomic classification based on viruses discovered using cultivation-free methods.

Improving taxonomic classification through computational analyses

A recurrent theme in accomplishing a robust computational framework for virus taxonomy is the power of sequence-similarity searches for identifying uncultivated viral sequences, assessing the validity and completeness of the recovered genomes, and identifying and functionally annotating genes and encoded proteins. Each newly identified virus sequence improves the potential of sequence-similarity search strategies, leading to further discovery and continually expanding our view and understanding of the virosphere. As a result of pioneering work in viruses, almost 50 years of data has been collected on genomic sequences from cultivated [21] and uncultivated [22] viruses, as well as cellular organisms in the tree of life. Computational analyses to compare and organize these data include sequence-based and profile-based searches, phylogenetic and phylogenomic tools, and clustering methods used to meaningfully identify and classify viruses in taxa at ranks from species to realm. Other tools exploit this information to distinguish viral and cellular

sequences in whole-community datasets, picking out the viral needles from the metagenomic haystack [23]. Different viral strains or subtypes can be distinguished through viromics, opening up new possibilities to distinguish evolutionary and ecological dynamics of uncultivated viruses in infected hosts and in natural biomes. Recent benchmarking studies based on simulated or mock community data provide information on the advantages and disadvantages of different computational tools for identifying and classifying viruses [24–26]. Viruses that are relatively closely related to known ones can be identified by direct sequence-similarity searches of whole genomes or taxon-specific hallmark genes, which are also used for meaningful phylogenies and taxonomic classification. Viruses that are relatively unknown, representing new members within higher ranks require sensitive profile hidden Markov model-based sequence-similarity searches and assessment of the statistical significance of the hits [26]. Moreover, fundamentally different approaches have been used, including using the absence of known gene families as a signal for identifying viral sequences [27] and homology-independent features, such as genomic coding structure including directionality of genes, intergenic regions, or replichores [28,29], and nucleotide usage patterns [30]. These genomic features may be extracted computationally from viral sequences and encoded into machine-learning tools to identify viruses in metagenomic data.

To facilitate taxonomic efforts, newly discovered viral sequences need to be consistently deposited into databases. Relevant information to be recorded varies widely for different groups of viruses, depending on the extent to which they have been sampled and studied in detail. On the one hand, relevant information in highly sampled clades (such as, severe acute respiratory syndrome coronavirus 2 [SARS-CoV-2], human immunodeficiency virus 1 [HIV-1], and influenza A viruses) includes well-annotated genomic variants with detailed functional and host information. On the other hand, information on viruses from sparsely sampled taxa, which may be found in more or less exotic hosts and environments, may remain limited to non-redundant sequence clusters based on protein-sharing networks, which may be used to delineate future viral taxa [5,6,31]. Because of their versatility and scalability, gene-sharing networks have been popular for presenting preliminary taxonomic classification of viruses discovered in metagenomes.

Recent breakthroughs in high-throughput discovery of uncultivated viruses notwithstanding, there is a bottleneck in annotation and taxonomic classification. The ICTV ratifies hundreds of taxonomy proposals each year [18–20], but the rate of virus discovery is several orders of magnitude higher. As a result, the number of viruses that are represented and classified in the International Nucleotide Sequence Database Collaboration (INSDC) and

RefSeq databases, which implement ICTV's taxonomy, remains relatively limited. Databases that gather the sequences of uncultivated viruses, such as the Integrated Microbial Genome/Viral Resources (IMG/VR) database, are more inclusive but necessarily also less curated, lacking manual annotation and potentially containing occasional 'false-positives' (*i.e.*, sequences from non-viral organisms), which are an inevitable result of using computational tools to make sense of the data [32,33]. It is also important to note that the performance of virus-identification tools is often assessed in cross-validation tests, assembled by randomly extracting training and testing data from the available sequences in the database (*e.g.*, in an 80:20 ratio, respectively). Such practices should be carefully designed to account for the biased composition of databases. The sequences extracted from a database do not typically have the same degree of novelty and diversity as a real dataset, and this biased representation may result in overestimation of a tool's performance. A promising approach is to omit sequences from entire higher-rank taxa, such as viral families from the training data to mimic their novel discovery, as was done for bacterial taxa to benchmark the taxonomic classification tool CAT [34]. Such an approach depends on clear and reproducible descriptions of viral taxa, ideally according to Findability, Accessibility, Interoperability, and Reusability (FAIR) Data Principles [35]. Attaining such descriptions and making them accessible to large-scale analyses poses a major challenge for the ICTV and the international virology community.

Completing virus taxonomy with uncultivated viruses

Our view of virus taxonomy is expanded by taxa that are based on viruses discovered using cultivation-free methods. Access to their genome sequences facilitates the identification of taxon-specific characteristics, including genomic properties, environmental affiliations, and biome-specific or regionally specific genomic features that may point towards host-differentiation. If virus taxonomy captures consistently evolving characteristics to represent lineages, uncultivated viruses may thus contribute new knowledge on the processes leading to the emergence of different taxa, facilitating their demarcation. As more viruses are discovered, classification becomes increasingly important to identify their relative positions in the taxonomic hierarchy (Figure 1).

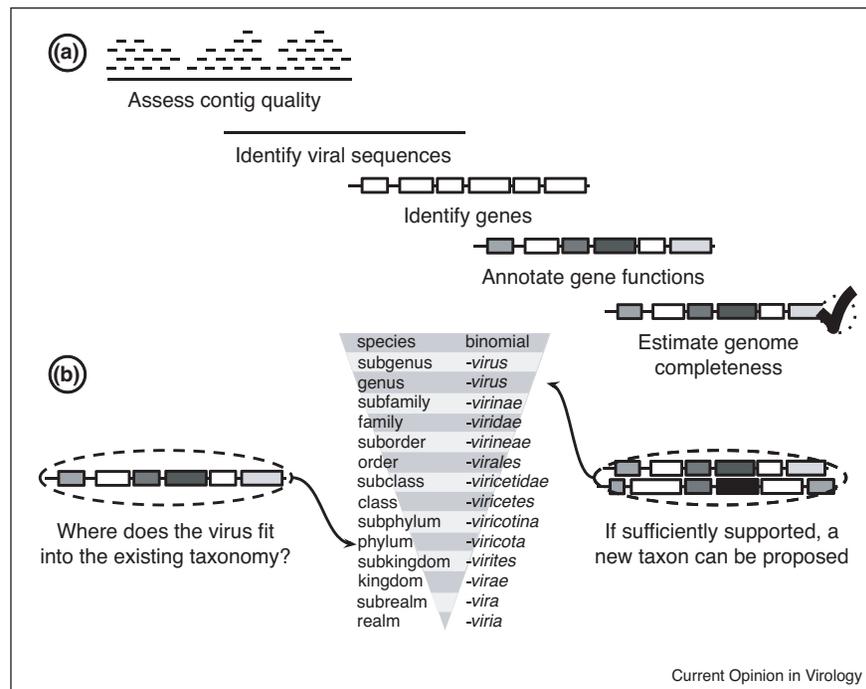
When a novel virus is discovered, researchers should consider submitting a taxonomy proposal to establish a new taxon, if sufficient supporting information is available. Changes to virus taxonomy should be submitted through taxonomy proposals to the ICTV, which centralizes the process while considering the opinions of the global virology community. Consistent with the replication of a virus in nature, the repeated observation of multiple similar genomes in independent experiments

is considered to be strong evidence that a sequence represents a real virus—although this is not required for an ICTV taxonomy proposal, and other evidence may be used as well. If a newly discovered virus belongs to a previously established taxon that falls within the scope of one of the ICTV Study Groups, that Study Group should be consulted and can assist in the submission of a taxonomy proposal. Taxonomy proposals are processed as part of a yearly cycle, with a deadline around May or June for submission to the relevant ICTV Subcommittee Chair, ICTV Executive Committee approvals over the summer, proposal revisions, voting by ICTV Members in October or November, and ratification around February. After ratification, the new taxonomy may be incorporated into public databases. For further details and contact information, please see the ICTV website at <https://ictv.global>.

Assembling and validating uncultivated virus genome sequences

Viral sequence assembly is performed with specialized software that generates contiguous sequences from short-sequencing reads, such as, Metaviral SPAdes (which exploits the specific coverage profile of viral contigs in metagenomes) [36] or SAVAGE (which can differentiate viral strains with sufficient coverage) [37]. Especially in metagenomes, sequences might be mis-assembled, so it is important to assess sequence validity. Benchmarking studies have shown that chimeras and mis-assemblies are rare but depend on the assembly program and parameter settings [38,39]. Because chimeric assemblies may occur more frequently among less-abundant genomes with incomplete horizontal coverage, high numbers of chimeras have been observed among shorter contigs, also a consequence of low abundance [40]. Moreover, chimeras are more likely to occur among genomes of organisms that share high levels of sequence similarity, such as closely related viral populations. Another issue that might occur is artificial replication of regions or the entire contig in the assembly. Assembled sequences should be investigated for potential assembly errors—for example, by mapping the sequencing reads to the assembled contigs, observing the depth-of-coverage profile, mapping of mate-paired reads, and multi-mapping reads. Long-read sequencing technologies may be used to validate contigs assembled from short-sequencing reads or bypass short-read sequencing altogether [41]. Recovering the same or highly similar sequences multiple times independently from different datasets or samples provides strong evidence for their validity. For example, two almost-identical sequences (one polymorphism in 96 908 nucleotides) of crAss-like bacteriophages were recovered from two gorilla feces samples [42]. Validity investigations and all experimental and computational methods used to identify uncultivated virus sequences should be clearly described in the taxonomy proposal. Moreover, it is critical that the raw data are deposited in one of the

Figure 1



(a) Before taxonomic classification of uncultivated viruses, important steps that may be integrated or jointly assessed include: assessing contig/genome quality, identifying viral sequences, gene calling and functional annotation, and estimating genome completeness. **(b)** The challenge of taxonomic classification consists of: (left) placing the uncultivated viruses into the existing taxonomy at the appropriate lower rank(s) and (right) proposing new taxa at a higher rank if it is sufficiently supported by data—for example, if two or more genome sequences representing the new taxon have been observed independently.

INSDC sequence-read archives so researchers can re-examine the original data, should any doubts arise.

Estimating the completeness of uncultivated viral genome sequences is a challenge that deserves special attention, since new taxa should only be proposed if at least coding-complete genome sequences of representative viruses have been determined. Arguably the strongest indication of a genome sequence being complete is its similarity in gene content to genomes from known viruses or to sequences that were independently assembled. Features, such as terminal repeats at the ends of an assembled contig, also indicate that the genome was completely assembled and likely reflect a circular or circularly permuted genome. However, it should be noted that these repeats might represent a repeated region within the same genome. Depending on the length and identity of the repeated region, these regions could trigger assembly programs to break the genome into fragments, and the repeated regions could also end up as identical ends of the contig. The computational tool CheckV estimates genome completeness and contamination for a viral sequence by taking into consideration contig circularity and similarity of the candidate sequence to related viral genomes [43]. Because of its dependency

on reference genomes, CheckV performs less well with viral genomes that have few or distant known relatives and when terminal repeats are lacking from the contig.

Assigning viruses to the existing taxonomy: how 'novel' is a virus?

As viruses are extremely diverse, many different approaches are used for the classification of viruses into different taxa [44]. Although several automated approaches assist in the process [6,45,46], no single tool is capable of correctly classifying viruses of all taxa or across all ranks. Thus, the challenge of automated taxonomic classification by placing viruses into the existing taxonomy based on their sequence remains unsolved (Figure 1b). Ideally, uncultivated virus sequences would be assessed for inclusion into all existing virus taxa at all ranks using their respective demarcation criteria, which are available in the ICTV taxonomy proposals and in the yearly reports. Observing a few arbitrary genera (Figure 2) illustrates that these criteria are diverse and, in some cases, non-specific, non-concrete, and impractical. In many cases, these taxonomic demarcation criteria are the result of careful investigations into the genetic characteristics of cultured viruses that best correspond to meaningful phenotypic properties and associations with

Figure 2

Supplementary Table 9. Current species demarcation criteria from ICTV 9th and 10th reports.

Group	Family	Genus	Demarcation	Reference
dsDNA virus	Ascoviridae	Ascovirus	Phylogenetic position of genes encoding homologs of IIV6 ORFs 022L, 037L, 067R, 075L, 142R, 176R, 295L, 347L, 393L and 428L. Presence or absence of occlusion bodies Lack of DNA/DNA hybridization with other species at low stringency Restriction enzyme fragment length polymorphisms (RFLPs) Host of isolation and experimental host range Tissue tropism Association with specific hymenopteran parasites, if apparent	ICTV 10th report
		Megalocytivirus	Megalocytiviruses are distinguished from ranaviruses and lymphocystiviruses by the presence of inclusion body-bearing cells and sequence analysis of key viral genes, e.g., ATPase and MCP, for which PCR primers have been developed. Most megalocytiviruses show >94% sequence identity within these genes, whereas sequence identity with ranaviruses and lymphocystiviruses is <50%. Based on sequence analysis and serological studies, all megalocytiviruses isolated to date appear to be strains of the same or a small number of closely-related viral species. Sequence analysis suggests the presence of three closely-related clusters composed of RSVI, ISKNV, and TRBIV and a fourth, more distant, cluster comprised of a single isolate, SDDV. Whether these clusters represent distinct species, or strains of a single species, remains to be resolved. In general ISKNV-like viruses have been isolated from freshwater fish,	ICTV 10th report
		Ranavirus	Ranavirus species are distinguished by multiple criteria including amino acid and nucleotide sequence identity/similarity, phylogeny, principal host species, genome size, genetic co-linearity, gene content, and G+C content. Many isolates within the genus show >90% sequence identity/similarity within the major capsid protein and other conserved proteins. In view of this high level of sequence identity, a re-evaluation of the number of ranavirus species is currently under consideration.	ICTV 10th report
		Chloriridovirus	Only very limited colinearity has been observed between IIV3 and the genome of any other IIVs sequenced to date. The genes of IIV3, like those of other members of the family, are likely not grouped by temporal class, lack introns, are closely-spaced, and are not present on overlapping strands of the viral genome. Because suitable <i>in vitro</i> replication systems are lacking, little is known about the viral replication strategy. However, as with other members of the family, overall replication strategy is thought to be similar to that of FV3.	ICTV 10th report
		Iridovirus	The MCP of IIV1 shows 66.4% amino acid (aa) sequence identity to that of IIV6 and approximately 50% or lower aa sequence identity to iridovirids in other genera. Less than 1% DNA–DNA hybridization was detected by the dot-blot method between IIV1 and IIV6 genomic DNA (stringency: 26% mismatch). Restriction endonuclease profiles (HindII, EcoRI, Sall) showed a coefficient of similarity of <66% between IIV1 and IIV6. Moreover, these species did not share common antigens when tested by tube precipitation, infectivity neutralization, reversed single radial immunodiffusion or enzyme-linked immunosorbent assay. Given the current ease of sequence determination, future demarcation of viral species will likely rely more on genomic sequence analysis, host range, clinical features, etc., and less on restriction endonuclease profiles, hybridization data, and immunological cross-reactivity.	ICTV 10th report

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A 2019 perspective [47] outlined Minimum Information about an Uncultivated Virus Genome (MIUViG) standards for reporting sequences of uncultivated virus genomes, including best practices and standing challenges for aspects, ranging from checking sequence validity to host prediction and abundance estimation in samples. This screenshot of the top of Supplementary Table 9 from this article [47] lists the taxonomic demarcation criteria extracted from the International Committee on Taxonomy of Viruses (ICTV) 9th Report and 10th Report.

hosts. However, the unformalized nature of the taxon descriptions causes poor reproducibility, making it difficult for researchers to reliably assign uncultivated viruses to established taxa, even if they have been ratified by the ICTV. Although this problem is aggravated in large-scale metagenomic studies, in which thousands of sequences need to be classified at once, the scale also invites opportunity to develop systematic approaches applicable to many viral genome sequences at once, including viruses that are not (yet) covered by ICTV taxon-specific Study Groups.

The diversity in taxonomic criteria is a consequence of the diversity of viruses, their multiple evolutionary origins [48], and the diverse community of researchers involved in defining these criteria over the past 50 years [15]. While the species concept remains under debate in virology even more so than in microbiology and mycology [49–52], factors that play a role in viral evolution include the nucleic acid type, genome length, host and vector diversity, and host defense systems. A flat 95% genome-wide sequence identity threshold for species demarcation has been nearly universally adopted across bacterial and archaeal viruses, mitigating the issue of unbalanced demarcation thresholds for different virus clades [53–55]. However, demarcation criteria remain variable among eukaryotic viruses, especially at low taxonomic

ranks (species and genera). For example, for uncultivated single-stranded DNA (ssDNA) viruses from the *Genomoviridae* and *Smacoviridae* families, 76–77% genome-wide pairwise identity of member viruses was chosen as a species demarcation threshold [56,57]. The reasons for this variability are rooted in the legitimate differences in the evolutionary rates, genome architectures, and replication strategies of viruses across different taxa, as well as variability in the taxonomically informative regions in viral genomes [58].

There are many ways to use virus genome sequence data for taxonomic classification. Ideally, taxonomic demarcation is based on the independent assessment of multiple genome properties with congruent conclusions. For example, the recent establishment of *Herelleviridae*, a new family of tailed bacteriophages, was based on a wide range of genomic taxonomy statistics, including marker-gene phylogenies, gene-sharing networks, and consistency in the overall genomic architecture [44]. Different levels of genomic similarity are required for classification at different taxonomic ranks. An example comes from the analysis of samples from patients with a febrile respiratory illness from whom two papillomavirus sequences were recovered. One of the two sequences was 99.8% identical to the previously identified genome of betapapillomavirus HPV49, whereas the other clustered with a

bootstrap value of 100% among gammapapillomaviruses yet was only 61.1% identical to the closest known genome sequence [59]. These findings suggest that both a member of an established species and a new species belonging to an established genus were discovered. The availability of many closely related virus genome sequences enables the structure of the taxonomy to be resolved in much more detail than is possible with only a few viruses. For example, fine-grained typing is possible in highly sampled clades of human-infecting viruses [60], whereas gene-sharing networks are revealing a coarse-grained structure of the taxonomy of bacteriophages [6].

A minimal requirement for valid automation of virus taxonomic assignment is the availability of the genome sequences of all previously identified viruses that are part of the taxonomy. Indeed, sequence similarity is one of the strongest signals for identifying viral sequences, estimating genome completeness, identifying genes, and predicting gene functions. Thus, expanding the virus sequence database is essential to make sense of the global virosphere [61,62]. Exemplar virus genome sequences of all ICTV-ratified virus species are available in INSDC databases, a requirement for their recognition by the ICTV and a guarantee that they can be sustainably accessed. The accession numbers for these sequences are available through the virus metadata resource (VMR, see <https://ictv.global/taxonomy/vmr/>). However, many more virus sequences belonging to these species are present in databases, and it may be difficult to identify them without performing specific searches and in-depth sequence analyses. Ultimately, the inclusion and demarcation criteria for all taxa should be made available in a machine-readable format so that they may be programmatically accessed and readily applied to viral sequences to support their classification.

Defining genomic taxonomy for uncultivated viruses and cellular organisms

Many different approaches have been used to define virus taxa based on genomic properties. Uncultivated virus genome sequences have been clustered into approximate species-rank clusters by direct DNA–DNA sequence comparison. Thresholds of 95% average nucleotide identity over 85% of the shorter sequence length have been suggested for double-stranded DNA (dsDNA) bacterial and archaeal viruses [47]. Clusters based on these criteria may be referred to as virus operational taxonomic units (vOTUs) and were shown to be consistent with biological species, for example in marine *Pseudoalteromonas* bacteriophages [63]. However, widely different and family specific identity thresholds are used for species demarcation of eukaryotic viruses. For instance, for uncultivated ssDNA viruses, 69–78% average nucleotide identity is used for species demarcation [64–66]. Uncultivated virus genome sequences have been clustered into approximate genus-level clusters by identifying statistically significant

overlap in encoded protein content [67,68]. The clustering can take multiple forms (e.g. hierarchical clustering after pairwise comparison of genomes, clustering of gene-sharing networks with fixed or variable thresholds, or application of an empirical threshold on shared gene content). Parameters may be adjusted to tweak the cluster size, and therewith determine whether the clusters reflect slightly higher or lower taxonomic ranks.

The gold standard in genomic taxonomy of cellular organisms involves identifying widely shared marker genes and generating phylogenies of (concatenated) alignments of the encoded proteins [69,70]. In contrast to the two approaches above, this is based on the phylogeny of one or several genes, which is taken to reflect the evolutionary history of the genomes where they are found. This approach yields a highly resolved phylogenetic tree wherein taxa may be defined at multiple ranks. In the case of viruses, this approach is limited to groups that share a marker or hallmark gene. Whereas cellular organisms often share tens to hundreds of genes, even when they belong to different taxonomic domains, not a single gene is shared across all viruses. Pragmatically, this limits any taxonomic approaches based on hallmark genes to groups that share such a gene [71]. Examples include: (a) The megataxonomy of all RNA viruses in the *Riboviria* realm is based on the presence of an RNA-directed RNA polymerase (RdRp) gene [72,73]; (b) Multiple families of eukaryotic ssDNA viruses are classified within the phylum *Cressdnaviricota* based on the phylogeny of the rolling circle replication initiation endonuclease [67]; (c) The terminase large subunit TerL, HK97-like major capsid protein, and portal protein are conserved across all bacterial and archaeal *Caudoviricetes* (tailed dsDNA viruses) and eukaryotic *Herpesvirales*, and have been used as the basis to establish the realm *Duplodnaviria* [72]. Single gene/protein phylogenies might be a realistic strategy to classify viruses with small RNA and ssDNA genomes. For viruses with larger genomes such as tailed bacterial and archaeal viruses (class *Caudoviricetes*), concatenated protein phylogenies become practical [46]. Critically, the phylogenies of individual marker genes should be compared to a phylogeny based on a concatenated alignment to assess potential horizontal gene transfer and taxonomic biases [74–76].

Conclusion: aligning computational classifications with ICTV-ratified taxa

Bioinformaticians have created computational tools for genomic taxonomy that cluster viruses based on genome similarity [6,45,77–80]. Although these tools provide a valuable first-order estimate of virus taxa, especially at lower ranks, they rarely assess hierarchical taxonomic structure across all ranks and may conflict with ICTV-ratified taxa that have been meticulously defined by experts. The main reason for this discrepancy is the fact that most current computational tools are based on a

single genomic character, whereas demarcation criteria for ICTV-ratified taxa are variable (Figure 2). By formulating taxonomic inclusion and demarcation criteria in a specific and concrete manner, bioinformaticians can help disclose virus taxonomy and assist the ICTV in incorporating the diverse demarcation criteria into computational tools and models. A notable collaboration to develop sequence-based taxonomy of cellular organisms (*Bacteria* and *Archaea*) resulted in the prokaryotic Genome Taxonomy Database (GTDB), which includes metagenome-assembled genomes, and has led to significant community engagement [81,82]. The open call for taxonomy proposals by the ICTV enables all virologists to participate and contribute to charting the structure of the virosphere.

Conflict of interest statement

Nothing declared.

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References and recommended reading

Papers of particular interest, published within the period of review, have been highlighted as:

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