RESEARCH

Physcraper: A Python package for continually updated phylogenetic trees using the Open Tree of Life

Luna L. Sanchez Reyes¹, Martha Kandziora^{1,2} and Emily Jane McTavish^{1*}

*Correspondence: ejmctavish@ucmerced.edu ¹School of Natural Sciences, University of California, Merced,

Full list of author information is available at the end of the article

Abstract

Background: Phylogenies are a key part of research in many areas of biology. Tools that automate some parts of the process of phylogenetic reconstruction, mainly molecular character matrix assembly, have been developed for the advantage of both specialists in the field of phylogenetics and non-specialists. However, interpretation of results, comparison with previously available phylogenetic hypotheses, and selection of one phylogeny for downstream analyses and discussion still impose difficulties to one that is not a specialist either on phylogenetic methods or on a particular group of study.

Results: Physcraper is a command-line Python program that automates the update of published phylogenies by adding public DNA sequences to underlying alignments of previously published phylogenies. It also provides a framework for straightforward comparison of published phylogenies with their updated versions, by leveraging upon tools from the Open Tree of Life project to link taxonomic information across databases. The program can be used by the nonspecialist, as a tool to generate phylogenetic hypotheses based on publicly available expert phylogenetic knowledge. Phylogeneticists and taxonomic group specialists will find it useful as a tool to facilitate molecular dataset gathering and comparison of alternative phylogenetic hypotheses (topologies).

Conclusions: The Physcraper workflow showcases the benefits of doing open science for phylogenetics, encouraging researchers to strive for better sharing practices. Physcraper can be used with any OS and is released under an open-source license. Detailed instructions for installation and usage are available at https://physcraper.readthedocs.io.

Keywords: gene tree; gene phylogeny; multilocus; interoperability; open science; reproducibility; public database; DNA alignment; Open Tree of Life; otol

Background

Phylogenies capture the shared history of organisms and provide key evolutionary context for our biological observations [1]. Updating existing phylogenies with publicly available molecular sequence data that has never been incorporated into any phylogenetic estimate provides the opportunity to simultaneously study the evolutionary history of many taxa in a reproducible and continuous manner. Increased taxonomic sampling is known to improve phylogenetic reconstructions [2, 3], time of divergence estimates [4, 5], and biogeographic analyses [6], as well as help in resolving phylogenetic conflict [7, 8, 3]. Here, we introduce Physcraper, a tool that establishes—Python package that provides a data interoperability framework for

Sanchez Reyes et al. Page 2 of 13

biological databases to automate data connections across biological databases, with the main goal of building on upon published alignments and extending phylogenies to extend existing phylogenetic inferences with more data and taxa. Physcraper updates a starting tree and single locus alignments with public DNA data, and links the tips in these sequence data available for more taxa in public DNA databases. Physcraper links tip taxon labels in the updated trees to a unified , interoperable taxonomic resource [9], effectively streamlining connections between phylogenies and any type of biological data.

Data Information such as geographical location, fossil ranges, and genetic and phenotypic information data increasingly available in public biological databases constitute an amazing resource for biological scientific discovery [10]. One of the main challenges for automatic integration of biological data across data across biological databases are varying taxonomic idiosyncrasies. To address this challenge, the Open Tree of Life project (OpenTree) created a unified taxonomy for automatic taxonomic name standardization, by integrating taxonomic data from several resources [9], including the USA National Center for Biodiversity Information (NCBI) taxonomy [11, 12], and the Global Biodiversity Information Facility (GBIF) [13] among others. By using the existing OpenTree taxonomy programmatic tools to map tip names, Physcraper has a framework for connecting, among many others. OpenTree's unified taxonomy, along with tools and methods to manage it, are available as Application Programming Interfaces (APIs), which are implemented as open access services for the general public [14]. Physcraper leverages on existing OpenTree's unified taxonomy APIs to automatically standardize taxon names in any phylogeny, a key step to streamline the connection of updated phylogenies with data from any different and independent biological database.

Decades of single locus sequencing have generated massive amounts of homologous DNA datasets that have the potential to be used for phylogenetic reconstruction at many scales [15]. More than a decade ago, GenBank release 159 (April 15, 2007) already hosted 72 million DNA sequences that were gauged to have the potential to resolve phylogenetic relationships of 98.05% of the almost 241,000 distinct taxa in the NCBI taxonomy at the time [15]. However, even thirteen years later, phylogenetic estimates for many most of these taxa are still not available [16]. OpenTree 's comprehensive assembles a comprehensive synthetic tree of life comprises comprising 2.3 million tips, of which around 90,000 are supported by phylogenies publicly available expert phylogenetic data, uploaded to OpenTrees' database (the Phylogystem [17]) by volunteer curators - the remaining 1.4 million taxa are placed in the synthetic tree based on OpenTree's unified taxonomy. There is a considerable amount of phylogenetically informative data in GenBank with the potential to fill these phylogenetic gaps in the tree of life, but this data either has not been analysed or the analyses have not been made publicly available and accesible [16].

Assembling a DNA alignment from such a massive database such as GenBank can be done "by hand", but that is a time-consuming approach which is not highly reproducible. A variety of largely non reproducible. Various computational pipelines that mine DNA databases fast, efficiently, and reproducibly have been developed and used to infer phylogenetic relationships in a variety of of many organisms (e.g., [18, 19, 20, 21]). While genomics has, and will continue to —revolutionize

Sanchez Reyes et al. Page 3 of 13

phylogenetic inference, the diversity of alternative genomic sequencing approaches implemented produce largely that are implemented produce widely non-overlapping homology hypotheses across taxa, creating challenges for phylogenetic reconstruction [22]. Phylogenomics addresses this problem by focusing on targeted capture of informative regions [23]. However, carefully curated markers and alignments can significantly improve phylogenetic reconstructions, even in phylogenomic analyses [24].

Physcraper improves on previous work in automating phylogenetic reconstruction by leveraging the power of that automates phylogenetic reconstruction, by leveraging on the knowledge contained in existing homology hypotheses that phylogeneticists and taxon specialists have assessed and deemed appropriate for a specific phylogenetic scope. There are almost 8,200 publicly available, peer-reviewed curated alignments, covering around 100,000 distinct taxa in the TreeBASE database [25][25, 26, 27], which can be leveraged used as seeds to mine molecular databases, and as "jump-start" alignments for phylogenetic reconstruction [28] to continually enrich, update and compare existing phylogenetic phylogenetic hypotheses to existing evolutionary knowledge.

Physcraper is implemented as a Python pipeline that uses OpenTree's programmatic access protocols (API's) APIs to automatically link any phylogeny mapped to OpenTree's standardized taxonomy [17] unified taxonomy, to alignments from TreeBASE, and data from GenBank. Its utility Physcraper's usage and functionalities are presented with a case-study analysis of a group of flowering plants, the hollies.

Implementation

Physcraper is implemented with Python and can be run on a Python interactive session, as a Python script, or using the command line interface we developed for it. It currently consists of 13 modules. For testing and improving Physcraper's Python code syntax quality, we used the Pylint software following instructions from its website [29] and manual [30], with a ".pylintrc" configuration file. As of now, all Physcraper modules have a Pylint score of 10/10.

The general Physcraper framework (Figure 1) consists of 4 steps: 1) identifying and processing a tree-phylogeny and its underlying alignment; 2) performing a BLAST search of DNA sequences from original alignment on GenBank, and filtering of new sequences; 3) profile-aligning new sequences to original alignment; 4) performing a phylogenetic analysis and comparing the updated tree-results to existing phylogenies.

The inputs: a tree phylogeny and an alignment

Taxon names in the input tree_phylogeny must be standardized to Open-Treetaxonomy [9]-'s unified taxonomy [31] using OpenTree's bulk Taxonomic Name Resolution Service (TNRS) tool [32]. Users can upload their own treephylogeny, or choose from among the 2, 950 standardized trees curated phylogenies stored in OpenTree's Phylesystem [33, 17] database [33] that also have alignments available on TreeBASE [25] the TreeBASE database [34, 35].

The input alignment is a single locus DNA dataset that was used in part or in whole to generate the input treephylogeny. Physcraper retrieves TreeBASE alignments automatically. Alternatively, users must can provide the path to a local copy

Sanchez Reyes et al. Page 4 of 13

of the alignment of their choosing. Only taxa that are both in the sequence alignment and in the tree phylogeny are considered further for analysis; at least one taxon and its corresponding sequence are required.

DNA sequence search and filtering

The Basic Local Alignment Search Tool, BLAST [36] is used for DNA sequence search either on a remote or a local GenBank database. It is constrained to a "search taxon", a taxonomic group in the NCBI taxonomy that is automatically identified using the OpenTree's taxonomic which corresponds to the Most Recent Common Ancestor (MRCA) API [37, 9], as the MRCA of all ingroup taxa that is also a named clade in the NCBI taxonomy (Figure 1). The search taxon is identified using OpenTree's unified taxonomic API [37].

BLAST is performed using the blastn algorithm [38] implemented in BioPython 's-1.71 [39] NCBIWWW module [40] modified to accept an alternative BLAST address. Each sequence in the alignment is BLASTed once against all DNA sequences in GenBank. New sequences are excluded for the GenBank database. Matching sequences are filtered and excluded from the analysis if they 1) are not in the search taxon; 2) have an e-value above the cutoff (default to 0.00001); 3) fall outside a min and max minimum and maximum sequence length threshold, defined as the a proportion of the average sequence length without gaps of all sequences in the input alignment (default values of 80% and 120%, respectively); 4) or, if they are either identical to or shorter than an existing sequence in the input alignment and they represent the same taxon in OpenTree or NCBItaxonomy. An NCBI's or OpenTree's unified taxonomy. By default, an arbitrary maximum number of randomly chosen 5 sequences per taxon are allowed (default to 5) chosen at random from the set of matching sequences that passed the filtering step.

Reverse, complement, and reverse-complement sequences are identified and translated using BioPython internal functions [39]. Iterative cycles of BLAST searches can be performed, by blasting all new sequences until no new ones are found. By default only one BLAST cycle is performed.

New DNA sequence alignment

MUSCLE [41] is used to perform a profile alignment in which the original alignment is used as a template of homology criteria to align new sequences. The final alignment is not further automatically checked, and additional inspection and refinement are recommended.

Tree Phylogenetic reconstruction and comparison

RAxML [42] is implemented to reconstruct a Maximum Likelihood (ML) gene tree phylogeny for each input alignment with default settings (GTRCAT model and 100 bootstrap replicates with default algorithm), using input tree the input phylogeny as starting tree for ML searches. Bootstrap results are summarized using DendroPy's SumTrees module [43].

Physcraper's main result is an updated phylogenetic hypothesis for the search taxon. Updated and original tree_phylogeies are compared with Robinson-Foulds weighted and unweighted metrics estimated_calculated with Dendropy [43], and with a node by node comparison between the synthetic OpenTree and the original and updated tree_phylogenies individually, using OpenTree's conflict API [44].

Sanchez Reyes et al. Page 5 of 13

Results

Case Study: The hollies

A user is interested in phylogenetic relationships within the genus *Ilex*. Commonly known as "hollies", the genus encompasses between 400-700 living species 400 [45] and 500 recognized living species [46], and is the only extant elade taxon within the family Aquifoliaceae, in the order Aquifoliales of flowering plants [47].

An online literature review in June 2020 (Google scholar search for "ilex phylogeny") reveals revealed that there are several published phylogenies showing studies addressing phylogenetic relationships within the hollies [48, 49, 50, 51][48, 45, 49, 50, 51, 52], but only two-the "Gottlieb2005" study [45] and the "Yao2020" study [52] have data openly available [45, 52]. [45] made original tree and alignment. The Gottlieb2005 phylogeny and alignment are available in TreeBASE (study 1091 [53]). The tree sampling. The Gottlieb2005 phylogeny samples 41 speciesis also available from , is available in OpenTree's Phylesystem (study pg_2827 [54]), and has been integrated into OpenTree's synthetic tree [55]. The most recent Yao2020 Ilex tree [52]is phylogeny is the most recent one for the genus [52], and it is only available in OpenTree's Phylesystem (study ot_1984 [56]), and in the DRYAD repository [57]. With 175 tips, the [52] tree Yao2020 phylogeny [52] is the best sampled phylogeny yet-available for the hollies.

We ran Physeraperon a laptop Linux computer to update an genus *Ilex*. In order to showcase Physcraper's performance, we chose the Gottlieb2005 phylogeny and a corresponding single locus alignment of the internal transcribed spacer DNA region (ITS) alignment from [45], using a local GenBank databaseas Physcraper inputs, to update relationships in the genus *Ilex*. Currently being the best sampled and most recent phylogenetic hypothesis for *Ilex*, we used the Yao2020 phylogeny as the ideal standard to compare results from this Physcraper case study.

We ran Physcraper on a computer node of the Multi-Environment Research Computer for Exploration and Discovery (MERCED) Linux cluster from the University of California, Merced, using one core at 2301 MHz RAM. BLAST and RAxML analyses ran for 19hrs 45min, with bootstrap analyses taking an additional 13hrs. The updated [45] tree Gottlieb2005 phylogeny [45] updated using Physcraper (Figure 2; Physcraper updated phylogeny from now on) displays all 41 distinct taxa from the original study plus 231 new tips, contributing phylogenetic data to 84 additional *Ilex* taxa. The best RaxML tree ML phylogeny from the RAxML analysis is 99% resolved, with 25% of nodes with bootstrap support < 0.1 and 48% nodes with bootstrap support > 0.75 (Figure 2A). A large portion of internal branches are negligibly small, with 30 branches < 0.00001 substitution rate units, from which only 9 have a bootstrap support > 0.75 (Figure 2). For comparison -As comparison with the Physcraper updated phylogeny, the Yao2020 phylogeny [52] also contains all 41 distinct taxa from the original [45]study, and contributes sampled in the Gottlieb2005 phylogeny [45], while contributing phylogenetic data to 134 additional *Ilex* taxa, from which. From these, 67 taxa are also in updated [45]. While [52] also used the Physcraper updated phylogeny. While the Yao2020 phylogeny [52] was also constructed using ITS as a marker, their GenBank data is not released yet, so. Hence, Physcraper was unable to incorporate 68 additional taxa into the analysis. However, taxa that are only on the Yao2020 phylogeny because Sanchez Reyes et al. Page 6 of 13

the DNA data is unavailable. We also note that Physcraper incorporates 18 *Ilex* taxa that are not in the Yao2020 phylogeny [52]. These taxa appear nested among other *Ilex* species (Figure 2B) and visual inspection of the DNA sequences suggests they are correctly assigned as *Ilex*. The ITS alignment that underlies the Yao2020 phylogeny was constructed without any tool to mine GenBank [52], which could explain why Physcraper was able to incorporate these 18 taxa that were not in [52]. additional *Ilex* taxa in the Physcraper updated phylogeny.

Verification test

To test the performance of Physcraper we performed a verification test in which we pruned 9 out of the 41 tips in the original Gottlieb2005 phylogeny [45], corresponding to a 20% trim, excluding the outgroups. We then performed a Physcraper run to test if we would recover the pruned tips. To perform the BLAST searches, Physcraper automatically drops sequences from the alignment belonging to taxa absent from the input phylogeny. The Physcraper updated phylogeny successfully recovered only 6 out of 9 pruned tips. Closer examination of results revealed that sequences for the 3 missing tips were correctly retrieved with BLAST along with the 6 sequences belonging to the remaining pruned tips. We then followed the GenBank accession numbers reported in [45] belonging to the sequences of the 3 missing tips, Ilex warburgii (accession number reported: U92600/U92601; updated: AH007153.2), *Ilex dimorphophylla* (accession number reported: U92592/U92593; updated: AH007149.2), and *Ilex percoriacea* (accession number: AH007156.2). We note that these three sequences contain a 100 bp long gap of unidentified nucleotides (Ns) that is completely absent from the original alignment. This caused them to exceed Physcraper's default sequence length cutoff of 120%, being thus filtered and excluded from further analyses. The missing ITS sequences do appear in Physcraper's output file "seqlen_mismatch.txt", that includes the accession number, taxon name, and sequence length of all BLAST matches that were filtered based on sequence length cutoffs set in the configuration file.

Discussion

Databases preserving and democratizing access to biological data have become essential resources for science. New molecular data keep accumulating and tools facilitating its integration into existent evolutionary knowledge contribute to the acceleration of scientific discovery.

Physcraper is a tool that builds upon previous knowledge stored in published alignments and phylogenies, taking advantage of OpenTree's services to facilitate comparison of phylogenies, with the main goal of extending our knowledge of phylogenetic relationships across the tree of life.

We believe this is a key step to successfully establish an open, reproducible workflow for phylogenetics, facilitating phylogenetic knowledge for ecologists and other non-specialists, effectively democratizing phylogenetic studies.

As a tool for automatizing phylogenetic reconstruction from molecular databases, Physcraper presents several advantages over existing phylogenetic pipelines designed to make evolutionary sense of the vast amount of public molecular data available. Sanchez Reyes et al. Page 7 of 13

Several analysis tools create full phylogenies *de novo* by mining of molecular databases [19, 15, 58, 59, 21]. In particular, Phylota [15], and PHLAWD [18], have been cited and used abundantly.

Physcraper builds on this automated database mining concept by incorporating prior phylogenetic work and existing taxonomic domain knowledge on appropriate markers and alignment construction. This decreases error (requiring less manual downstream processing) and eases comparison with previous phylogenetic knowledge.

Results from the verification test highlight the importance of incorporating existing expertly curated homology statements to automatically update phylogenetic relationships, instead of ignoring the information they contain and building homology statements fully *de novo*.

We encourage users to look at the output files containing information about the filtered sequences, and potentially modify configuration parameters such as the sequence length cutoff parameter, based on the filtered sequences. Default filtering parameters are arbitrary, but we hope that by making the process of locating homologous sequences online reproducible, and tracking what filters are used, we make it easier for researchers to delve into the effect that different choices have on their inferences. This is in contrast to "manual" searches for taxa, where similarly arbitrary filters are applied, but are difficult to trace. As many studies have shown [60] the effect of missing data can be enigmatic, and interact with the true phylogenetic relationships for the data set at hand. There is not currently strong support in the literature for any particular cutoff value, and rather than prescribe specific approaches, we encourage users to explore the effects of different choices on their phylogenetic inferences. In addition, by providing the output files at each step of the analysis, it is straightforward to assess how changing parameter and software choices do or do not drive differences in phylogenetic inference. By gathering the sequences, and making the unaligned files easily available to users, researchers can compare if applying any alternate alignment tool of their choice affects inferences. Once sequences are aligned, they can apply and compare inferences from any phylogenetic software.

Organellar genome sequences, such as chloroplasts and mitochondria will also generally be excluded from automatic addition based on default Physcraper length cutoffs. Multiple sequence alignment of loci of drastically different lengths is unfeasible, and we have found in testing that it often returns incorrect results, splitting shorter sequences with many long gaps to align with exact matches across the entire longer locus. While it would be possible to directly extract the BLAST match from genomes, this would exclude potentially homologous flanking regions which are not matched by BLAST's local search algorithm, but that may be important for phylogenetic inference. Instead we list the accession numbers for these matches in the "seqlen mismatch txt" file, for users to assess and incorporate appropriate homologous regions to their alignment of interest.

Unlike phylogenetic placement approaches [61, 62], which add new taxa without modifying the input treephylogeny, Physcraper estimates all the relationships anew in the context of the new data. PUMPER [20] shares these conceptual strengths, but is no longer under active development, is challenging to install and run, and has resulted in very few phylogenetic analyses since its publication.

Sanchez Reyes et al. Page 8 of 13

Physcraper generates gene trees, which individually do not capture the full complexity of species' evolutionary history [63]. However, Physcraper facilitates In addition, single gene phylogenies with very high numbers of taxa may lack sufficient signal for accurate phylogenetic resolution [64]. The Physcraper workflow avoids this challenge by focusing on ingroup taxa of an existing phylogeny, using markers that have been assessed and proven appropriate for that phylogenetic scope in past publications. Also, Physcraper thins alignments by removing sequences identical to original and newly added sequences, and by setting a maximum number of sequences per taxon. Nonetheless, it is incumbent on users to assess their final inference with respect to statistical support and biological plausibility.

In the era of phylogenomics, rigorous analyses of multiple loci still allow for more complex evolutionary models than analyses of large genomic data sets, and in many cases can provide better evolutionary estimates. For example [65] show that when applying coalescent models, there is more information in two genes of 300 bp each than in 600 independent sites. Physcraper is designed to facilitate gathering alignments and gene trees for multiple loci from a group of interest, that together can be used to reconstruct species trees taking into account coalescent processes with ASTRAL [66], BEAST2 [67], or SVD Quartets [68]. Physcraper's "multi locus py" module allows to automatically merge the outputs of Physcraper runs from different loci into input files for the two software mentioned above, or as concatenated alignments for supermatrix analyses.

Our case study application of Physcraper to update a phylogeny of the genus *Ilex* is based on a single marker, so we expect for it to be not as well resolved as phylogenies resulting from analyses that used multiple markers. Although not perfect, we think the Physcraper updated *Ilex* phylogeny seems biologically reasonable in different ways. All samples corresponding to the ingroup cluster together forming a monophyletic group (Figure 2A), and samples belonging to the same *Ilex* species also form monophyletic groups (Figure 2B). *Rigorous analyses of multiple loci allows for more complex evolutionary models than analyses of large genomic data sets, and can provide better evolutionary estimates. A notable exception is samples of the species *Ilex* theeizans*, which appear as non-monophyletic in the updated phylogeny as well as in the original Gottlieb2005 phylogeny. A visual comparison of the Yao2020 phylogeny and the original Gottlieb2005 phylogeny suggests that the relationships within the genus *Ilex* are still being actively determined*, and that increased taxon sampling might be key to resolve them.

Physcraper has the added advantage of facilitating the linkage of taxonomic information about tips in the output phylogenies to data available in a variety of biological databases [9], such as geographical locations for taxa from the GBIF [13]. Taxonomic links, and comparisons to existing published phylogenies in the OpenTree data store can also help flag paralogous sequences. Accidentally including paralogs as homologs is a risk in phylogenetic analyses, and can be more prevalent in automated analyses than in manually curated analyses. We provide users with several tools to try to assess homology of their aligned sequences. The estimated gene phylogeny itself is an evolutionarily explicit way to visualize gene evolution, which in concert with taxonomic labelling can reveal paralogy. OpenTree's conflict analysis tool informs the users of whether their phylogeny contains major conflicts

Sanchez Reyes et al. Page 9 of 13

with established taxonomy and any phylogenetic context they wish to compare to. This tool also returns information on taxonomic and phylogenetic conflicts that exist in the original input phylogeny. Detected conflicts may be a sign that taxonomy needs to be updated, or may be a sign that non-homologous sequences have been included in the analysis. These taxonomic and phylogenetic conflicts flag regions of the phylogeny for the researcher to more closely examine and assess homology.

The Physcraper workflow can be used to rapidly (in a matter of hours) create phylogenies which can address challenges overarching both fields of ecology and evolution, such as phylogenetically placing newly discovered species [69], curating taxonomic assignments [70], and generating custom trees for ecological [71] and evolutionary downstream analyses [72].

Conclusions

Data repositories hold more information than meets the eye. Beyond the main data, they are rich sources of metadata that can be leveraged for the advantage of all areas of biology as well as the advancement of scientific policyand applications, applications and education. Initial ideas about the data are constantly changed by results from new analyses. Physcraper provides a framework for reproducible phylogenetics that has the potential to consistently provide context for these ideas, highlighting the importance of data sharing and open science in the fieldfor phylogenetics, biology and science.

Availability and requirements

Project name: Physcraper

Project home page: https://physcraper.readthedocs.io/en/latest/index.html

Operating System: Linux, Mac, Windows

Programming Language: Python
Other requirements: Dependencies

License: GNU

Any restrictions to use by non-academics: As specified by the License

Abbreviations

OpenTree: The Open Tree of Life project
TNRS: Taxonomic Name Resolution Service
MRCA: Most Recent Common Ancestor
BLAST: Basic Local Alignment Search Tool

NCBI: USA National Center for Biodiversity Information

GBIF: Global Biodiversity Information Facility

API: Application Programming Interface

Declarations

Ethics approval and consent to participate Not applicable.

Consent for publication Not applicable.

Sanchez Reyes et al. Page 10 of 13

Availability of data and materials

The Code and datasets generated and analysed during the current study are available in the repositories "physcraper" containing the source code, https://github.com/McTavishLab/physcraper; "physcraperex" containing the examples, https://github.com/McTavishLab/physcraperex; and, "physcraper_ms" containing this reproducible manuscript, https://github.com/McTavishLab/physcraper_ms.

Competing interests

The authors declare that they have no competing interests.

Funding

This research was supported by the grant "Sustaining the Open Tree of Life", NSF ABI No. 1759838, and ABI No. 1759846. Computer time was provided by the Multi-Environment Research Computer for Exploration and Discovery (MERCED) cluster from the University of California, Merced (UCM), supported by the NSF Grant No. ACI-1429783.

Authors' contributions

LLSR wrote manuscript, alignment code, documentation, performed analyses and developed examples; MK wrote code for ncbidataparser module, filtering of sequences per OTU and using offline blast searches, wrote documentation and tests; EJM conceived study, wrote most of the code, documentation and tests. All authors contributed to the manuscript and gave final approval for publication.

Acknowledgements

We thank the members of the OpenTree development team and the "short bar" Science and Engineering Building 1, UCM, joint lab paper discussion group for valuable comments on this manuscript. We also thank the valuable comments of David Posada, Rutger Vos, and an anonymous reviewer that greatly improved an earlier version of this manuscript.

Author details

¹School of Natural Sciences, University of California, Merced, USA. ²Department of Botany, Faculty of Science, Charles University, Prague, Czech Republic.

References

- Dobzhansky, T.: Nothing in biology makes sense except in the light of evolution. The American Biology Teacher 35(3), 125–129 (1973)
- 2. Hillis, D.M.: Inferring complex phylogenies. Nature 383(6596), 130-131 (1996)
- Natsidis, P., Tsakogiannis, A., Pavlidis, P., Tsigenopoulos, C.S., Manousaki, T.: Phylogenomics investigation of sparids (Teleostei: Spariformes) using high-quality proteomes highlights the importance of taxon sampling. Communications biology 2(1), 1–10 (2019)
- 4. Schulte, J.A.: Undersampling taxa will underestimate molecular divergence dates: an example from the South American lizard clade Liolaemini. International Journal of Evolutionary Biology 2013 (2013)
- Soares, A.E., Schrago, C.G.: The influence of taxon sampling on bayesian divergence time inference under scenarios of rate heterogeneity among lineages. Journal of Theoretical Biology 364, 31–39 (2015)
- Kayaalp, P., Stevens, M.I., Schwarz, M.P.: Back to Africa: increased taxon sampling confirms a problematic Australia-to-Africa bee dispersal event in the Eocene. Systematic Entomology 42(4), 724–733 (2017)
- Hedtke, S.M., Townsend, T.M., Hillis, D.M.: Resolution of phylogenetic conflict in large data sets by increased taxon sampling. Systematic Biology 55(3), 522–529 (2006)
- Townsend, J.P., Lopez-Giraldez, F.: Optimal selection of gene and ingroup taxon sampling for resolving phylogenetic relationships. Systematic Biology 59(4), 446–457 (2010)
- Rees, J.A., Cranston, K.: Automated assembly of a reference taxonomy for phylogenetic data synthesis. Biodiversity Data Journal (5) (2017). doi:10.3897/BDJ.5.e12581
- 10. Baxevanis, A.D., Bateman, A.: The importance of biological databases in biological discovery. Current Protocols in Bioinformatics **50**(1), 1–1 (2015)
- Federhen, S.: The NCBI Taxonomy database. Nucleic Acids Research 40(D1), 136–143 (2012). doi:10.1093/nar/gkr1178. Publisher: Oxford Academic. Accessed 2020-12-03
- 12. Schoch, C.L., Ciufo, S., Domrachev, M., Hotton, C.L., Kannan, S., Khovanskaya, R., Leipe, D., Mcveigh, R., O'Neill, K., Robbertse, B., Sharma, S., Soussov, V., Sullivan, J.P., Sun, L., Turner, S., Karsch-Mizrachi, I.: NCBI Taxonomy: a comprehensive update on curation, resources and tools. Database **2020** (2020)
- GBIF Secretariat: GBIF Backbone Taxonomy. Checklist Dataset. doi:10.15468/39omei. Accessed via GBIF.org on April 2021. https://www.gbif.org/dataset/d7dddbf4-2cf0-4f39-9b2a-bb099caae36c
- 14. OpenTreeOfLife, Redelings, B., Cranston, K.A., Allman, J., Holder, M.T., McTavish, E.J.: Open Tree of Life APIs V. 3.0. https://github.com/OpenTreeOfLife/germinator/wiki/Open-Tree-of-Life-Web-APIs
- Sanderson, M.J., Boss, D., Chen, D., Cranston, K.A., Wehe, A.: The PhyLoTA Browser: Processing GenBank for Molecular Phylogenetics Research. Systematic Biology 57(3), 335–346 (2008). doi:10.1080/10635150802158688.
- https://academic.oup.com/sysbio/article-pdf/57/3/335/24203605/57-3-335.pdf

 16. McTavish, E.J., Drew, B.T., Redelings, B., Cranston, K.A.: How and Why to Build a Unified Tree of Life.
- BioEssays 39(11) (2017). doi:10.1002/bies.201700114. Number: 11. Accessed 2018-04-10
 17. McTavish, E.J., Hinchliff, C.E., Allman, J.F., Brown, J.W., Cranston, K.A., Holder, M.T., Rees, J.A., Smith, S.A.: Phylesystem: A git-based data store for community-curated phylogenetic estimates. Bioinformatics 31(17), 2794–2800 (2015). doi:10.1093/bioinformatics/btv276
- Smith, S.A., Beaulieu, J.M., Donoghue, M.J.: Mega-phylogeny approach for comparative biology: an alternative to supertree and supermatrix approaches. BMC Evolutionary Biology 9(1), 37 (2009). doi:10.1186/1471-2148-9-37

Sanchez Reyes et al. Page 11 of 13

 Antonelli, A., Hettling, H., Condamine, F.L., Vos, K., Nilsson, R.H., Sanderson, M.J., Sauquet, H., Scharn, R., Silvestro, D., Töpel, M., et al.: Toward a self-updating platform for estimating rates of speciation and migration, ages, and relationships of taxa. Systematic Biology 66(2), 152–166 (2017). doi:10.1093/sysbio/syw066

- Izquierdo-Carrasco, F., Cazes, J., Smith, S.A., Stamatakis, A.: Pumper: phylogenies updated perpetually. Bioinformatics 30(10), 1476–1477 (2014). doi:10.1093/bioinformatics/btu053
- 21. Pearse, W.D., Purvis, A.: phylogenerator: an automated phylogeny generation tool for ecologists. Methods in Ecology and Evolution 4(7), 692–698 (2013)
- Jones, M.R., Good, J.M.: Targeted capture in evolutionary and ecological genomics. Molecular Ecology 25(1), 185–202 (2016). doi:10.1111/mec.13304
- Andermann, T., Torres Jiménez, M.F., Matos-Maraví, P., Batista, R., Blanco-Pastor, J.L., Gustafsson, A.L.S., Kistler, L., Liberal, I.M., Oxelman, B., Bacon, C.D., Antonelli, A.: A guide to carrying out a phylogenomic target sequence capture project. Frontiers in Genetics 10(1407), 1–20 (2020). doi:10.3389/fgene.2019.01407
- Fragoso-Martínez, I., Salazar, G.A., Martínez-Gordillo, M., Magallón, S., Sánchez-Reyes, L., Lemmon, E.M., Lemmon, A.R., Sazatornil, F., Mendoza, C.G.: A pilot study applying the plant Anchored Hybrid Enrichment method to New World sages (*Salvia* subgenus Calosphace; Lamiaceae). Molecular Phylogenetics and Evolution 117, 124–134 (2017). doi:10.1016/j.ympev.2017.02.006
- 25. Piel, W., Chan, L., Dominus, M., Ruan, J., Vos, R., Tannen, V.: Treebase v. 2: A database of phylogenetic knowledge. e-Biosphere. London (2009)
- Vos, R.A., Balhoff, J.P., Caravas, J.A., Holder, M.T., Lapp, H., Maddison, W.P., Midford, P.E., Priyam, A., Sukumaran, J., Xia, X., et al.: NeXML: rich, extensible, and verifiable representation of comparative data and metadata. Systematic Biology 61(4), 675–689 (2012). doi:10.1093/sysbio/sys025
- 27. Piel, W.H., Vos, R.A.: Treebasedmp: A toolkit for phyloinformatic research. bioRxiv, 399030 (2018)
- Morrison, D.A.: Multiple sequence alignment for phylogenetic purposes. Australian Systematic Botany 19(6), 479–539 (2006). doi:10.1071/SB06020
- 29. Thénault, Sylvain (Logilab S.A.): Pylint. Accessed: March 2021. https://www.pylint.org/
- Thénault, Sylvain (Logilab S.A.), PyCQA, and contributors: Pylint User Manual. Accessed: March 2021. http://pylint.pycqa.org/en/latest/
- 31. OpenTreeOfLife, Redelings, B., Cranston, K.A., Allman, J., Holder, M.T., McTavish, E.J.: Open Tree of Life Taxonomy V. 3.2. https://tree.opentreeoflife.org/about/taxonomy-version/ott3.2
- OpenTreeOfLife: Name Resolution (TNRS) bulk mapping tool. https://tree.opentreeoflife.org/curator/tnrs/
- 33. OpenTreeOfLife, E.J. McTavish, Hinchliff, C.E., Allman, J.F., Brown, J.W., Cranston, K.A., Holder, M.T., Rees, J.A., Smith, S.A.: Phylesystem's top-level repository in the Open Tree of Life phylogenetic study document store. https://github.com/opentreeoflife/phylesystem
- 34. Piel, W., Chan, L., Dominus, M., Ruan, J., Vos, R., Tannen, V.: TreeBASE: A Database of Phylogenetic Knowledge. https://treebase.org/treebase-web/home.html
- Vos, R.: SuperTreeBASE: data dump and code to summarize TreeBASE. https://github.com/TreeBASE/supertreebase
- Altschul, S.F., Gish, W., Miller, W., Myers, E.W., Lipman, D.J.: Basic local alignment search tool. Journal of Molecular Biology 215(3), 403–410 (1990). doi:10.1016/S0022-2836(05)80360-2
- OpenTreeOfLife, Rees, J.A., Cranston, K.: OpenTree's taxonomic MRCA API. https://github.com/OpenTreeOfLife/germinator/wiki/Taxonomy-API-v3#mrca
- 38. Camacho, C., George, C., Vahram, A., Ning, M., Jason, P., Kevin, B., Thomas, L.: BLAST+: Architecture and applications. BMC Bioinformatics 10(1), 421 (2009). doi:10.1186/1471-2105-10-421
- Cock, P.J., Antao, T., Chang, J.T., Chapman, B.A., Cox, C.J., Dalke, A., Friedberg, I., Hamelryck, T., Kauff, F., Wilczynski, B., et al.: Biopython: freely available Python tools for computational molecular biology and bioinformatics. Bioinformatics 25(11), 1422–1423 (2009). doi:10.1093/bioinformatics/btp163
- The BioPython Contributors (1999-2018): BioPython 1.71, Module Bio.Blast.NCBIWWW. Accessed: April 19, 2018. https://biopython.org/DIST/docs/api/Bio.Blast.NCBIWWW-module.html
- Edgar, R.C.: Muscle: multiple sequence alignment with high accuracy and high throughput. Nucleic Acids Research 32(5), 1792–1797 (2004). doi:10.1093/nar/gkh340
- Stamatakis, A.: Raxml version 8: a tool for phylogenetic analysis and post-analysis of large phylogenies. Bioinformatics 30(9), 1312–1313 (2014). doi:10.1093/bioinformatics/btu033
- Sukumaran, J., Holder, M.T.: DendroPy: a Python library for phylogenetic computing. Bioinformatics 26(12), 1569–1571 (2010). doi:10.1093/bioinformatics/btq228
- Redelings, B.D., Holder, M.T.: A supertree pipeline for summarizing phylogenetic and taxonomic information for millions of species. PeerJ 5, 3058 (2017). doi:10.7717/peerj.3058
- Gottlieb, A.M., Giberti, G.C., Poggio, L.: Molecular analyses of the genus ilex (aquifoliaceae) in southern south america, evidence from aflp and its sequence data. American Journal of Botany 92(2), 352–369 (2005). doi:10.3732/ajb.92.2.352
- 46. The Plant List 2013. Version 1.1: List of Name Records for the Generic Epithet *llex*. http://www.theplantlist.org/tpl1.1/search?q=ilex
- 47. Chase, M.W., Christenhusz, M., Fay, M., Byng, J., Judd, W.S., Soltis, D., Mabberley, D., Sennikov, A., Soltis, P.S., Stevens, P.F.: An update of the Angiosperm Phylogeny Group classification for the orders and families of flowering plants: APG IV. Botanical Journal of the Linnean Society 181(1), 1–20 (2016)
- Cuénoud, P., Martinez, M.A.d.P., Loizeay, P.-A., Spichiger, R., Andrews, S., Manen, J.-F.: Molecular phylogeny and biogeography of the genus *Ilex* L.(Aquifoliaceae). Annals of Botany 85(1), 111–122 (2000). doi:10.1006/anbo.1999.1003
- Manen, J.-F., Barriera, G., Loizeau, P.-A., Naciri, Y.: The history of extant *Ilex* species (Aquifoliaceae): evidence of hybridization within a Miocene radiation. Molecular Phylogenetics and Evolution 57(3), 961–977 (2010). doi:10.1016/j.ympev.2010.09.006
- 50. Setoguchi, H., Watanabe, I.: Intersectional gene flow between insular endemics of Ilex (Aquifoliaceae) on the

Sanchez Reyes et al. Page 12 of 13

- Bonin Islands and the Ryukyu Islands. American Journal of Botany **87**(6), 793–810 (2000). doi:10.2307/2656887
- Selbach-Schnadelbach, A., Cavalli, S.S., Manen, J.-F., Coelho, G.C., De Souza-Chies, T.T.: New information for *Ilex* phylogenetics based on the plastid psbA-trnH intergenic spacer (Aquifoliaceae). Botanical Journal of the Linnean Society 159(1), 182–193 (2009). doi:10.1111/j.1095-8339.2008.00898.x
- 52. Yao, X., Song, Y., Yang, J.-B., Tan, Y.-H., Corlett, R.T.: Phylogeny and biogeography of the hollies (*Ilex L.*, Aquifoliaceae). Journal of Systematics and Evolution **58**(5), 1–10 (2020). doi:10.1111/jse.12567
- Gottlieb, A.M., Giberti, G.C., Poggio, L.: TreeBASE study 1091. https://treebase.org/treebase-web/search/study/summary.html?id=1091
- Gottlieb, A.M., Giberti, G.C., Poggio, L.: Phylesystem study pg_2827. https://tree.opentreeoflife.org/curator/study/edit/pg_2827/?tab=home
- 55. OpenTreeOfLife, Redelings, B., Reyes, L.L.S., Cranston, K.A., Allman, J., Holder, M.T., McTavish, E.J.: Open Tree of Life Synthetic subtree, node id mrcaott68451ott89474. https://tree.opentreeoflife.org/opentree/opentree12.3@mrcaott68451ott89474/Ilex-theizans--Ilex-dumosa
- 56. Yao, X., Song, Y., Yang, J.-B., Tan, Y.-H., Corlett, R.T.: Phylesystem study ot_1984. https://tree.opentreeoflife.org/curator/study/view/ot_1984
- 57. Yao, X., Song, Y., Yang, J.-B., Tan, Y.-H., Corlett, R.T.: Phylogeny and biogeography of the hollies (*llex L.*, Aquifoliaceae), Dryad, Dataset. https://datadryad.org/stash/dataset/doi:10.5061/dryad.k0p2ngf4x. Accessed: April 2020
- Smith, S.A., Walker, J.F.: Pyphlawd: A python tool for phylogenetic dataset construction. Methods in Ecology and Evolution 10(1), 104–108 (2019). doi:10.1111/2041-210X.13096
- Bennett, D.J., Hettling, H., Silvestro, D., Zizka, A., Bacon, C.D., Faurby, S., Vos, R.A., Antonelli, A.: phylotar: An automated pipeline for retrieving orthologous dna sequences from genbank in r. Life 8(2), 20 (2018). doi:10.3390/life8020020
- Huang, H., Knowles, L.L.: What Is the Danger of the Anomaly Zone for Empirical Phylogenetics? Systematic Biology, 047 (2009). doi:10.1093/sysbio/syp047. Accessed 2015-07-24
- Berger, S.A., Krompass, D., Stamatakis, A.: Performance, Accuracy, and Web Server for Evolutionary Placement of Short Sequence Reads under Maximum Likelihood. Systematic Biology, 010 (2011). doi:10.1093/sysbio/syr010. Accessed 2015-01-12
- 62. Matsen, F., Kodner, R., Armbrust, E.V.: pplacer: linear time maximum-likelihood and Bayesian phylogenetic placement of sequences onto a fixed reference tree. BMC Bioinformatics 11(1), 538 (2010). Number: 1
- Song, S., Liu, L., Edwards, S.V., Wu, S.: Resolving conflict in eutherian mammal phylogeny using phylogenomics and the multispecies coalescent model. Proceedings of the National Academy of Sciences 109(37), 14942–14947 (2012). doi:10.1073/pnas.1211733109
- Morel, B., Barbera, P., Czech, L., Bettisworth, B., Hübner, L., Lutteropp, S., Serdari, D., Kostaki, E.-G., Mamais, I., Kozlov, A.M., Pavlidis, P., Paraskevis, D., Stamatakis, A.: Phylogenetic Analysis of SARS-CoV-2 Data Is Difficult. Molecular Biology and Evolution (msaa314) (2020). doi:10.1093/molbev/msaa314. Accessed 2021-03-30
- Zhu, T., Yang, Z.: Complexity of the simplest species tree problem. Molecular Biology and Evolution (msab009) (2021). doi:10.1093/molbev/msab009. Accessed 2021-03-30
- Mirarab, S., Reaz, R., Bayzid, M.S., Zimmermann, T., Swenson, M.S., Warnow, T.: ASTRAL: genome-scale coalescent-based species tree estimation. Bioinformatics 30(17), 541–548 (2014). doi:10.1093/bioinformatics/btu462
- Bouckaert, R., Vaughan, T.G., Barido-Sottani, J., Duchêne, S., Fourment, M., Gavryushkina, A., Heled, J., Jones, G., Kühnert, D., Maio, N.D., Matschiner, M., Mendes, F.K., Müller, N.F., Ogilvie, H.A., Plessis, L.d., Popinga, A., Rambaut, A., Rasmussen, D., Siveroni, I., Suchard, M.A., Wu, C.-H., Xie, D., Zhang, C., Stadler, T., Drummond, A.J.: BEAST 2.5: An advanced software platform for Bayesian evolutionary analysis. PLOS Computational Biology 15(4), 1006650 (2019). doi:10.1371/journal.pcbi.1006650. Publisher: Public Library of Science
- Chifman, J., Kubatko, L.: Quartet inference from SNP data under the coalescent model. Bioinformatics 30(23), 3317–3324 (2014). doi:10.1093/bioinformatics/btu530. Publisher: Oxford Academic
- 69. Webb, C.O., Slik, J.F., Triono, T.: Biodiversity inventory and informatics in Southeast Asia. Biodiversity and Conservation 19(4), 955–972 (2010). doi:10.1007/s10531-010-9817-x
- San Mauro, D., Agorreta, A.: Molecular systematics: a synthesis of the common methods and the state of knowledge. Cellular & Molecular Biology Letters 15(2), 311 (2010). doi:10.2478/s11658-010-0010-8
- Helmus, M.R., Ives, A.R.: Phylogenetic diversity-area curves. Ecology 93(sp8), 31–43 (2012). doi:10.1890/11-0435.1
- Stoltzfus, A., Lapp, H., Matasci, N., Deus, H., Sidlauskas, B., Zmasek, C.M., Vaidya, G., Pontelli, E., Cranston, K., Vos, R., et al.: Phylotastic! making tree-of-life knowledge accessible, reusable and convenient. BMC Bioinformatics 14(1), 158 (2013). doi:10.1186/1471-2105-14-158
- OpenTreeOfLife, Redelings, B., Reyes, L.L.S., Cranston, K.A., Allman, J., Holder, M.T., McTavish, E.J.: Open Tree of Life Synthetic Subtree of the Genus *Ilex*, Node Id Ott727571. https://tree.opentreeoflife.org/opentree/opentree12.3@ott727571/Ilex

Sanchez Reyes et al. Page 13 of 13

Figure 1 The Physcraper framework consists of four general steps. The star represents the "search taxon", the Most Recent Common Ancestor (MRCA) of all taxa in the ingroup that is also a named clade in the NCBI taxonomy. The software is fully described on its documentation website at https://physcraper.readthedocs.io, along with installation instructions, function usage descriptions, examples and tutorials.

Figure 2 A) Phylogeny updated with Physcraper using a starting phylogeny and an alignment from original [45] tree (Gottlieb2005 data in Btext). Tips in original alignment and new tips added with Physcraper are depicted in black and red, respectively. Physcraper obtained sequences from the GenBank database via local BLAST of all sequences in from the Gottlieb2005 internal transcribed spacer DNA region (ITS) original alignmentthat generated tree in B), filtered them following criteria from described in section "DNA sequence search and filtering", aligned them to the original alignment using MUSCLE, and performed a phylogenetic reconstruction using RAXML, with 100 bootstraps. B-D-B) Results of conflict analyses analysis performed with using OpenTreetools's conflict tool [44]. The Physcraper updated Gottlieb2005 phylogeny in (A) was compared to an Ilex OpenTree synthetic subtree v. 12.3 [73] constructed using taxonomy of the genus as backbone and resolving branches based on phylogenetic data from the original Gottlieb2005 phylogeny. Green branches are resolved by the updated phylogeny, blue branches are in agreement between the updated phylogeny and the syntehtic subtree, and orange branches are in conflict between the two.