Software for Systematics and Evolution

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Who is Who in Phylogenetic Networks: Articles, Authors and Programs

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Abstract.—The phylogenetic network emerged in the 1990s as a new model to represent the evolution of species in the case where coexisting species transfer genetic information through hybridization, recombination, lateral gene transfer, etc. As is true for many rapidly evolving fields, there is considerable fragmentation and diversity in methodologies, standards and vocabulary in phylogenetic network research, thus creating the need for an integrated database of articles, authors, techniques, keywords and software. We describe such a database, "Who is Who in Phylogenetic Networks", available at http://phylnet.univ-mlv.fr. "Who is Who in Phylogenetic Networks" comprises more than 600 publications and 500 authors interlinked with a rich set of more than 200 keywords related to phylogenetic networks. The database is integrated with web-based tools to visualize authorship and collaboration networks and analyze these networks using common graph and social network metrics such as centrality (betweenness, eigenvector, degree and closeness) and clustering. We provide downloads of raw information about entries in the database, and a facility to suggest modifications and contribute new information to the database. We also present in this article common use cases of the database and identify trends in the research on phylogenetic networks using the information in the database and textual analysis. [Phylogenetic network, co-authorship network, social networks, phylogenetic networks keywords.]

The phylogenetic network has gained popularity in 1 the past two decades as a model of evolution capable 2 of accounting for vertical inheritance as well as gene 3 flow events such as recombination, hybridization and л horizontal gene transfer, which the simple tree-based model fails to do. The rapid evolution of the body of knowledge related to, and the community working on, phylogenetic networks has led to significant variety in 8 many phylogenetic methodologies, such as reconstruction 9 and classification, and software to compute, evaluate, 10 compare, and visualize phylogenetic networks. Although 11 some surveys (Lapointe 2000; Makarenkov et al. 2006; 12 Morrison 2010; Huson and Scornavacca 2011; Nakhleh 13 2013; Morrison 2014) and books (Huson et al. 2011; 14 Morrison 2011; Dress et al. 2012; Gusfield 2014) describe 15 this variety, "Who is Who in Phylogenetic Networks" is 16 the first resource of its kind aiming to consolidate this 17 diversity into an easily navigable database. 18

¹⁹ The website was started in 2007 as an interactive ²⁰ bibliographic database of phylogenetic networks ²¹ research, based on an open source project, BibAdmin ²² (https://gforge.inria.fr/projects/bibadmin/).

The code has been extensively extended to incorporate capabilities to draw word clouds and network visualizations. New graphs and sections were also added to the website to present the raw information in the database in a more meaningful way.

In addition to providing information about the com-28 munity working on phylogenetic networks, "Who is 29 Who in Phylogenetic Networks" makes available an 30 easy-to-use interface to study the evolution of a new, 31 swiftly growing scientific community. This database and 32 the associated website are intended to serve as an 33 encyclopedic and bibliographic resource of information 34 about the community, tools, models and methods related 35 to phylogenetic networks. Such a resource has inherent 36 value for current members of the phylogenetic commu-37 nity, particularly researchers and students new to the 38 field, as well as the community working on biological 39 methods in general. 40

AUTHORS AND KEYWORDS IN THE DATABASE

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Authors

Each author's entry in the database has associated 43 with it a picture, the author's country of origin as 44 determined automatically from the domain name of the 45 author's website, a link to the author's personal or 46 professional homepage, as well as a link to view his or her 47 publications in Google Scholar. Each publication's entry 48 in the database consists of, in addition to essential data 49 about the publication itself, a set of keywords, a DOI 50 link, and an abstract, if available. 51

Keywords

Publications in the database are manually tagged 2 by keywords, which help identify articles or methods 3 based on: (i) the nature of the problem solved in an article (reconstruction, consensus, labeling, comparison, 5 generation, visualization, etc.) and its computational complexity (NP-complete, APX-hard, polynomial); (ii) the nature of algorithms given in an article ("exponential algorithm" and "FPT" – for "fixed-parameter tractable" are approaches to solving NP-hard problems exactly, 10 whereas "approximation" or "heuristic" algorithms aim 11 to find approximate solutions); (iii) the nature of input 12 data; (iv) the restrictions on subclasses of networks 13 studied in the article (e.g. "galled trees", "tree-child 14 networks", etc.); (v) the existence of an implementation, 15 indicated by the tag "software"; (vi) the names of softw-16 are, articles and methods used or implemented (keywords 17 starting with the word "Program"). A definition is 18 provided for technical keywords. Furthermore, keywords 19 act as a convenient and meaningful navigational aid in 20 the website, as described in several use cases below. 21

USE CASES

The main page of the "Who is Who in Phylogenetic Networks" highlights four use cases, corresponding to an action users might wish to take or a type of information they might wish to obtain: find experts, explore research, discover software and follow the community.

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Find Experts

This section comprises two types of co-authorship network visualizations: first, a set of precomputed graphs augmented with various social network metrics; and second, a set of dynamic graphs with metrics computed directly on the user's computer.

Each node in a precomputed graph is tagged with 34 measures of degree, authority, hub, number of triangles 35 containing that node as a vertex, betweenness centrality, 36 closeness centrality, eigenvector centrality, clustering 37 coefficient and eccentricity (for definitions, see e.g. 38 Estrada 2015). All of these metrics are computed using 39 the open source network analysis tool Gephi (Bastian 40 et al. 2009). The web interface makes it possible for the 41 user to see the global evolution of the phylogenetic netw-42 ork community by displaying the network corresponding 43 to any year from 1990 through 2015. 44

The dynamic graphs (Fig. 1) provide the user suf-45 ficient flexibility to display only those nodes fulfilling 46 customizable structural and temporal constraints. It is 47 possible to display the co-authorship network for any 48 arbitrary range of time, and focus only on authors 49 with a configurable minimum number of publications. 50 Nodes can be colored along a linear gradient depending 51 on the values of the degree, the number of triangles 52 containing that node as a vertex, or the centrality 53 measures mentioned above. This makes the dynamic 54

graph amenable to visual analysis, and enables easy 55 identification of significant nodes in the community. For 56 instance, the social network metrics available enable 57 visual identification of nodes that are "central" in their 58 communities, linked to many other nodes, or act as 59 "bridges" between communities. Nodes that do not pass 60 the specified criterion of a chosen minimum number 61 of publications are ignored in the calculation of the 62 color gradient. The user may also choose to highlight 63 the authors belonging to a particular country, or see a 64 detailed research profile and the list of indexed articles of 65 an author, simply by clicking on the corresponding node. 66

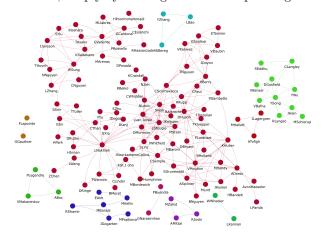


FIGURE 1. A screenshot of a portion of the 2014 coauthorship network in "Who is Who in Phylogenetic Networks".

Information about journals and conferences the phylogenetic networks community publishes in or meets at is presented in the form of tag clouds. In addition to providing an exhaustive listing of publication venues, these give visual hints about the relative importance of journals and conferences, and may help to identify possible venues for submission, or find articles on phylogenetic methods. The size and color of a word in a tag cloud varies across a logarithmic scale, with larger size and warmer colors representing a greater number of publications in the corresponding journal or conference.

The entire community working on phylogenetic networks is depicted pictorially as a collage of authors' photos. The dimensions of an author's picture represent the number of publications by that author weighted by the number of co-authors on each publication.

The "Find Experts" section also consists of a coauthorship network visualization enriched with information about keywords in the database, and with the capability to color nodes, representing authors, across a gradient depending on their "focus", the fraction of total publications of the corresponding author tagged with a keyword, or their "prolificacy", the total number of publications of the corresponding author tagged with a keyword, if they satisfy a customizable threshold of minimum number of publications.

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Explore Research

Publications in the database are accompanied by infor-2 mation on their media of publication or presentation, 3 such as books, journals, conferences and theses. This 4 section includes bar charts illustrating the trend of all 5 indexed publications about phylogenetic networks or those including a particular keyword.

The "Explore research" section also consists of a word-8 cloud of keywords, and also a "tree cloud" (Gambette q and Véronis 2010) plus a natural extension of this, a 10 "network cloud" built using NeighborNet (Bryant and 11 Moulton 2004). These provide a global view of the 12 database, and display all keywords structured in the 13 form of a tree depicting their semantic relationships, 14 automatically deduced from their co-occurrence in the 15 database. Here, too, the size and color of a word in a 16 word-cloud varies along a logarithmic scale, with larger 17 size and warmer color representing a greater number of 18 publications containing the corresponding keyword. 19

Discover Software

The structure of the website and the presence of 21 keywords makes it possible for biologists to identify one 22 or more programs suitable to study their data, which 23 might be in a particular format or structure. A network 24 depicting relationships between input data and programs 25 aids this process. Each keyword corresponding to a 26 certain type of input data (starting with "from", such as 27 "from sequences", "from distances", "from rooted trees", 28 etc.) links to keywords representing software (starting 29 with "Program", such as "Program SplitsTree", "Pro-gram Phylonet", "Program TCS", etc.). Each program 30 31 has a short description including a download link. 32

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Follow Community

Using the "Follow community" feature, a user can 34 receive an update whenever a particular author's article 35 is indexed or when a new article is published by any 36 author in the community. 37

MAPPING THE PHYLOGENETIC NETWORKS 38 RESEARCH AND COMMUNITY 39

In this section, we demonstrate how the "Who is 40 Who in Phylogenetic Networks" database can be used 41 to analyze trends about the community of researchers 42 working on phylogenetic networks. We focus first on their 43 collaborations, and second on their research interests. 44

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Evolution of the Co-authorship Network

The co-authorship network provided on the "Who is 46 Who in Phylogenetic Networks" website shows how indi-47 vidual research groups working on phylogenetic networks 48 started developing inter-group research collaborations, 49

which are represented as connected components in the graph. Increasing collaboration results in the merging of connected components over the years from 1991 through 2015. In fact, it is natural that, as more and more publications are taken into account to build this network. its largest connected component (a "giant" component) becomes larger with time.

In order to analyze in greater detail the evolution of the global structure of the co-authorship network, we focus on uniform-sized time slices, rather than consider all publications added since the oldest one. Therefore, we focus on the 2005-2015 period, where the number of publications is great enough (more than 30 articles per year). We generated the co-author graph for slices or periods of 5 years starting from 2005 (2005 through 2009, 2006 through 2010 and so on), connecting two authors if they have published at least three publications together in a slice or period. We chose this threshold because it implies that the linked researchers have worked on more than one project together; as the conference versions of journal papers are referenced on the website, choosing a threshold of two publications would not have been high enough for this purpose.

The main connected component of the graph reveals interesting information about the structure of collaborations over the years¹. For instance, in the 2005-2009, 2006-2010 and 2007-2011 periods, it always contains only Luay Nakhleh and his co-authors. Furthermore, Luay Nakhleh is an author of almost all publications (except one) explaining the edges in these connected components. However, for the later years, the main connected components do not contain such a single vertex that is adjacent to all of the other vertices. Furthermore, the size of the connected component in the first three periods is at most ten, whereas for the three last periods, it ranges between 12 and 15. This shows that in recent years, several distinct groups, especially in Europe (France, the Netherlands, the UK, Germany and Sweden), have started collaborating to conduct research on phylogenetic networks.

Mapping the Phylogenetic Network Research Topics

We also study the trends and characteristics of 91 phylogenetic networks research topics, by using the 92 Digital Object Identifiers (DOIs) stored in the "Who 93 is Who in Phylogenetic Networks" database. The DOIs 94 allow easy access to the abstracts of the publications, using scientific databases such as the Web of Sci-96 ence (https://www.webofknowledge.com/) or Scopus 97 (https://www.scopus.com/). Again, we focus on the 98 2005-2015 period, to have a high enough and stable 99 number of publications in each year. Using Scopus, we 100 found the abstracts for 305 publications in this period. 101

First, we performed a factor analysis on the abstracts 102 grouped together by year (see Fig. 2), using Lexico 103

¹The corresponding complete dataset is available at https://goo.gl/vA8U6G.

3 (http://www.lexi-co.com). In the factor graph, we 1 find a time trend, with the years 2005 through 2009 on 2 the right side, years 2010 and 2011 in the middle, and 3 years 2012 through 2015 on the left side. Vocabulary that is significantly overrepresented in the 2005-2009 period includes "recombination", "hgt", "sequences", "consensus" and "metrics". In the 2012-2015 period, "reconciliation", "trinets", "cost", "duplication", "loss" and "binary" are overrepresented. This reflects the 9 recent development of efficient methods to reconstruct 10 reconciliation scenarios taking into account not only 11 lateral gene transfer but also duplication and loss, as well 12 as the introduction of new combinatorial objects related 13 to networks, like trinets. 14

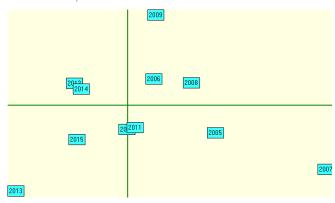


FIGURE 2. Factor analysis of the abstracts of 305 publications about phylogenetic networks in the 2005-2015 period, grouped by year.

Second, we performed the factor analysis of all 15 documents, as shown in Fig. 3. The graph highlights 16 interesting characteristics of the phylogenetic networks 17 research topics. The main axis distinguishes between 18 the more algorithmic or mathematical papers on the 19 right side ("n", "networks", "algorithm", "phyloge-netic", "rooted", "time", "vertices", "number") and 20 21 the more biological papers on the left side ("gene", 22 "hgt", "reconciliation", "transfer", "methods", "infere-23 nce", "species", "lineage"). The second axis seems to 24 25 distinguish between approaches that explicitly reconstruct abstract or explicit phylogenetic networks at 26 the top ("networks", "split", "phylogenetic", "circular", "class', "taxa", "cluster", "trinets", "quartet"), and 27 28 reconciliation scenarios, with a special focus on the 29 model, at the bottom ("gene", "hgt", "reconciliation", "lineage", "lgt", "transfer", "species", "duplication", 30 31 "model"). Note that the isolated paper in the bottom 32 right corner is very mathematical and deals with proving 33 a formula, with this formula presented in this article's 34 abstract, and this explains its unusual position in the 35 representation. Our results do not change if we remove 36 this article's abstract from the corpus. 37

A similar kind of analysis can be used on a subset of publications to focus on a more specific topic, and this can be useful, for example, when composing a research article, where it may be helpful to provide an overview of the research done so far, or the state of the art.

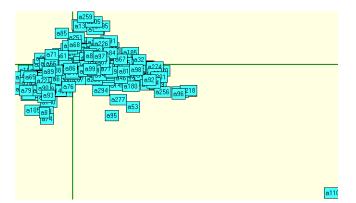


FIGURE 3. Factor analysis of the abstracts of 305 publications about phylogenetic networks in the 2005-2015 period.

AVAILABILITY

"Who is Who in Phylogenetic Networks" is freely available online at http://phylnet.univ-mlv.fr. The database and website code is open source and available at https://github.com/tushar-agarwal/phylnet.

CONCLUSION

We described "Who is Who in Phylogenetic Networks", a database associated with web-based tools that allow users to explore the community of researchers working on phylogenetic networks and the research done in this field. Not only is the database of inherent value in trying to present the diversity in the methodologies and vocabulary in research on phylogenetic networks in a single location, but it is useful both for researchers working on designing new methods involving phylogenetic networks, and for bioinformaticians who wish to obtain an overview of existing methods to perform analyses on their data. We also showed how the content present in this database can be used for general analyses about the research, and the social network of researchers, in this field.

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