1 iTaxoTools 0.1: Kickstarting a specimen-based software toolkit for taxonomists

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23 Abstract

- 24
- 25 While powerful and user-friendly software suites exist for phylogenetics, and an impressive
- 26 cybertaxomic infrastructure of online species databases has been set up in the past two decades,
- 27 software specifically targeted at facilitating alpha-taxonomic work, i.e., delimiting and
- 28 diagnosing species, is still in its infancy. Here we present a project to develop a bioinformatic
- 29 toolkit for taxonomy, based on open-source Python code, including tools focusing on species
- 30 delimitation and diagnosis and centered around specimen identifiers. At the core of iTaxoTools is
- 31 user-friendliness, with numerous autocorrect options for data files and with intuitive graphical
- 32 user interfaces. Assembled standalone executables for all tools or a suite of tools with a launcher
- 33 window will be distributed for Windows, Linux, and Mac OS systems, and in the future also
- 34 implemented on a web server. The alpha version (iTaxoTools 0.1) distributed with this paper
- 35 contains GUI versions of six species delimitation programs (ABGD, ASAP, DELINEATE,
- 36 GMYC, PTP, tr2) and a simple threshold-clustering delimitation tool. There are also new Python
- 37 implementations of existing algorithms, including tools to compute pairwise DNA distances,
- 38 ultrametric time trees based on non-parametric rate smoothing, species-diagnostic nucleotide
- 39 positions, and standard morphometric analyses. Other utilities convert among different formats of
- 40 molecular sequences, geographical coordinates, and units; merge, split and prune sequence files
- 41 and tables; and perform simple statistical tests. As a future perspective, we envisage iTaxoTools
- 42 to become part of a bioinformatic pipeline for next-generation taxonomy that accelerates the
- 43 inventory of life while maintaining high-quality species hypotheses.
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- 45 Key words: integrative taxonomy, molecular diagnosis, species delimitation, ABGD, PTP,
- 46 GMYC, TR2, DELINEATE, Limes.
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50 Introduction

51

52 Bioinformatics has become the core of modern biology, especially in the context of high-

53 throughput workflows that are becoming commonplace in many fields, in particular related to -

54 omics approaches. The big data volumes obtained by these techniques require ever more efficient

and sophisticated software, which is being developed and refined at a vigorous pace. In the field

56 of systematics, powerful programs for phylogenetic analysis have been developed, and databases

57 and data aggregators have been set up to deal with the massive globally-generated taxonomic

58 dataset comprised of over one million species and many millions of specimen records. Yet, only

59 few bioinformatic tools so far have been tailored to specifically fit the practical work of

taxonomists, who diagnose and name some 15,000–20,000 new species of organisms per year, a

task that still is largely performed by single or small teams of (professional and amateur)
 researchers (Miralles et al. 2020). Most existing tools are aimed at the construction of

identification keys (e.g. Dallwitz, 1974; Clark 2003; Delgado Calvo-Flores et al. 2006; Zhang et

al. 2006; MacLeod 2008; Vignes Lebbe 2015; Tofilski 2018), which in some groups help field

65 identification. Only a handful of software packages (EDIT: cybertaxonomy.eu, TaxonWorks:

66 taxonworks.org, Scratchpads: scratchpads.org) are tailored towards facilitating descriptive work

67 itself, but none of these is so far widely used; furthermore, these programs do not include various

68 important aspects of the alpha-taxonomic workflow, such as species delimitation or molecular

69 diagnosis (Miralles et al. 2020) which can also be of high relevance for other fields such as

70 molecular ecology.

71 Although most taxonomic studies are still relying on morphology only (as shown in a recent 72 review; Miralles et al. 2020), taxonomy increasingly integrates diverse lines of evidence (Padial 73 et al. 2010), a procedure called integrative taxonomy by Dayrat (2005). Discovering, delimiting, 74 diagnosing, and naming new species requires taxonomists to examine voucher specimens and 75 associated catalogues, field books and pictures; take, tabulate and statistically analyze 76 morphometric measurements; define, tabulate and document phenotypic character states; estimate 77 geographical ranges based on specimen provenances; align and analyze DNA sequences; and 78 elaborate accurate specimen tables, species diagnoses and identification keys. Depending on the 79 organism under study, it also may involve more specialized procedures such as comparing 80 acoustic and visual signal repertoires of animals, or isolate and culture unicellular organisms. In 81 addition, to fulfil standards of cybertaxonomy, data sets need to be archived in specialized

repositories and new species names registered in online databases (Miralles et al. 2020). With

rising best-practice standards, these many and varied tasks generally involve the use of different

computer programs – and thus lead to an extra burden on taxonomists who may lack

85 bioinformatic training.

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88 The concept of iTaxoTools

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90 We aim to develop a bioinformatic platform to facilitate the core work of taxonomists, that is,

91 delimiting, diagnosing and describing species. Our initiative produced an integrative taxonomy

92 toolkit – iTaxoTools (Fig. 1; Table 1). The concept of iTaxoTools rests on four pillars: (1) **fully**

93 **open source** code; (2) a **diversified** set of stand-alone programs ('modules') that in future

94 versions will become increasingly interconnected; (3) a **specimen-centered** architecture, where at

95 present tables (tab-delimited text files) with specimen identifier columns serve as main input

96 format; and (4) a focus on user-friendliness, accessibility, and clear and transparent

97 documentation.

All of the code developed by us is **fully open source** and available from a dedicated GitHub repository (https://github.com/iTaxoTools). In the case of tools programmed by other researchers, we make this information transparent, and the GUI we added specifies the original references and

101 programmers. The current pre-release of compiled executables is available from

102 https://github.com/iTaxoTools/iTaxoTools-Executables. See Table 2 for repositories of each103 single tool.

104 The toolkit is **diversified**, including simple format converters of molecular or geographic

data, text and spreadsheet merging and pruning, simple statistical analyses e.g. of morphometric
 data, but especially focuses on two main aspects: species delimitation and diagnosis, based on
 multiple kinds of data.

108 The distribution of the tools is also diversified, including command-line tools for those users 109 familiar/comfortable with Python; standalone GUI executables of each module for Windows, 110 Linux, and Mac operating systems for those looking for a single functionality, e.g. a converter, to 111 be called from a single and easily portable file – these tools will necessarily be 'heavier' and 112 slightly slower than command-line executables; and a single software package containing all 113 libraries (currently developed for Windows and Linux), from which each module can be launched 114 (Fig. 2). In the future, the latter software package will also enable data transfer between different 115 modules. The GUI software versions are designed to be stable over many different versions of the 116 respective operating systems, e.g., from Windows 7 to Windows 10.

117 Alpha taxonomy is a primarily **specimen-centered** research field in which specimens – 118 mostly single individual organisms or parts thereof, or cultured isolates composed of multiple 119 individuals - are grouped into species. Consequently, iTaxoTools has implemented tab-delimited 120 text as standard format for most tools, with one column indicating the specimen identifier. This 121 will in subsequent versions allow the user to save the output of different tools for each specimen, 122 and combine these results for further analysis. The tab-delimited format also allows easy editing 123 of the data tables in spreadsheet editors. This specimen-based architecture needed for alpha-124 taxonomic programs remains valid whether specimens are represented by physical vouchers, 125 images, or in the future maybe by full genome sequences.

126 Simplicity and **user-friendliness** are at the core of the toolkit we are developing. Because 127 the majority of taxonomists is not familiar with programming languages, such as Python, all our 128 tools are accessible via graphical user interfaces (GUI) – analyses can therefore be carried out 129 with a few intuitive mouse clicks, under default or custom settings, without the need to enter 130 commands in a command line. We also have added autocorrect routines to avoid the loss of time 131 associated with the search for small misspellings or incorrect characters in input files that cause 132 programs to fail. Furthermore, we will provide detailed manuals and wikis with screenshots, 133 along with example files. We chose Python as the main programming language for our package, 134 because it is characterized by its good readability and simple-to-learn syntax, and we documented 135 newly written code extensively, to allow its re-use by other programmers. This comes at the cost 136 of speed that would have been achieved by using the C programming language, but our toolkit in 137 this early phase is not designed to cope with huge genomic datasets or analyses with tens of thousands of specimens. Currently iTaxoTools is designed to provide support for the most 138 139 common taxonomic research projects that discover and name a limited number of species only

140 (Miralles et al. 2020), but will be extended to large-scale projects in the future.

141 Considering that powerful programs exist for phylogenetic, phylogenomic and DNA

- 142 metabarcoding analyses, we did not attempt to include such functionalities in our toolkit.
- Similarly, we also did not focus on dedicated multiple sequence alignment programs or genome assemblers because (i) these bioinformatic tasks are more efficiently carried out by programs
- assemblers because (i) these bioinformatic tasks are more efficiently carried out by programs
 written in C language, (ii) GUI-driven programs and pipelines already exist for alignment and
- 146 phylogeny (e.g., PAUP, MEGA, PAUP, BEAST: Swofford 2003; Kumar et al. 2018; Bouckaert
- 147 et al. 2019), genomics, and DNA metabarcoding (e.g., Anslan et al. 2017) and (iii) there is an
- 148 active community both of commercial companies and academic research teams constantly
- 149 extending these kinds of programs. We are, however, adding graphical user interfaces and new
- 150 functionalities to other existing tools that are important for analyses in the context of systematics
- and that are not yet optimized with user-friendly GUIs. For instance, we have updated the code of
- 152 Partitionfinder (Lanfear et al. 2016) from Python v. 2 to v. 3, and aim to add a GUI also to the
- 153 sequence alignment program MAFFT (Katoh & Standley 2013). These developments will be154 added successively to iTaxoTools.
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- 155 156

157 Functionalities implemented in iTaxoTools 0.1

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159 Our work on iTaxoTools is ongoing and will be intensified in the period 2021–2023 thanks to

160 support by the DFG SPP 1991 TaxonOmics priority funding program. The current version,

161 published along with the present article, already includes a series of functional tools that we

162 predict will be useful in different steps of the alpha-taxonomic workflow, Data Preparation

- 163 (mainly Conversion), Analysis, Delimitation, and Diagnosis.
- 164

165 Data Preparation

166 Several tools convert among data formats, with the major modules being **dnaconvert** for

167 converting among common DNA sequence formats, **latlonconverter** for converting among

- 168 geographic coordinate systems (elaborated upon below), and **pyr8s** for converting non-
- 169 ultrametric trees to ultrametric. A collection of simpler tools includes fastmerge and fastsplit for
- 170 splitting and merging large fasta and fastq files, including advanced filtering options by sequence
- 171 name or sequence motif; **specimentablemerger** and **specimentablepruner** for splitting and
- 172 merging tab-delimited text files by specimen identifiers; **linebreaker** for converting among Linux
- and Windows line-break styles (often necessary when processing input files from other
- 174 bioinformatic tools); nodenamecorrector for replacing all non-standard ASCII characters from

175 Newick-format trees; and **unitconverter** for distance, time, volume, molarity, and other units.

- 176 **dnaconvert** is a versatile tool to convert DNA (and protein) sequence data among
- commonly used formats such as fasta, fastq, phylip, or nexus (Fig. 3). Compared to other
- sequence format converters, dnaconvert is particularly user-friendly in that it autocorrects
- 179 numerous issues that usually create compatibility problems, e.g., by automatically replacing non-180 standard ASCII characters from sequence names or auto-renaming sequences in formats of
- 180 standard ASCII characters from sequence names of auto-renaming sequences in formats of 181 limited sequence name length such as phylip. A main novelty is the support for tab-delimited files
- 182 because in our experience, it is useful, for small to medium-sized taxonomy projects, to store and
- 183 organize specimen-based DNA sequence information (DNA barcodes) in spreadsheet editors
- 184 such as Microsoft Excel or its freeware equivalents Libre Office / Open Office Calc. From these
- 185 spreadsheets, it is then easy to copy-paste the sequence, specimen-voucher, species and locality
- 186 columns into dnaconvert and obtain a sequence file for analysis, e.g. in fasta format, with all
- 187 respective information concatenated in the sequence name. The program also supports a format in

188 which these metadata are bracketed as required for uploading the sequence data along with

189 metadata to the NCBI Genbank repository (i.e., via Submission Portal or BankIt). Lastly, the

190 program also converts Genbank flatfiles into a tabular format, allowing the user to immediately

have all relevant metadata associated with the Genbank record in separate columns in aspreadsheet.

193 latlonconverter allows batch conversion of geographic coordinates from a large number of 194 different formats into standard decimal format as required by most geographical information 195 system (GIS) programs. By performing a series of autocorrections of possible typos and then 196 using a heuristic approach, latlonconverter is able to recognize and transform many idiosyncratic 197 formats of geographical coordinates as they are commonly found in specimen databases 198 containing geographical information taken by different researcher. With **spartmapper**, 199 geographical coordinates in combination with a species partition file (spart; Miralles et al. 200 submitted) can be previewed on a map, and then transformed in a kml file that plots all localities 201 on Google Earth and visualizes the geographical distribution of respective species hypothesis

202 (Fig. 4).

203 pyr8s is one of our flagship modules (Fig. 5). For many evolutionary analyses, but also for 204 species delimitation (e.g. GMYC), ultrametric phylogenies are required where non-ultrametric 205 trees are available. This conversion is rather complex and can be time-intensive. While numerous programs exist to calculate time trees (e.g., MCMCtree, BEAST, MEGAX: Yang & Rannala 206 207 2006; Bouckaert et al. 2019; Kumar et al. 2018), they usually require DNA sequence information 208 in addition to a previously inferred phylogenetic tree. For iTaxoTools, we opted to recuperate a 209 vintage approach, non-parametric rate smoothing (NPRS), initially developed by Sanderson 210 (1997) and later implemented as part of the program r8s (Sanderson 2003). This method only 211 requires a phylogenetic tree as input, with the option to add one or more time calibration points. 212 NPRS has previously been implemented in the R package ape (Paradis et al. 2004), but was 213 removed from the latter and from the newest releases of r8s due to licensing issues. Specifically, 214 the original version of r8s relied on a modified implementation of Powell's conjugate direction 215 method which was incompatible with open-source licensing (Powell 1964; Gill et al. 1981; Press 216 et al. 1992). In the GUI-driven tool **pyr8s**, the NPRS algorithm has been newly coded, making 217 use of the open-source libraries DendroPy (Sukumaran & Holder 2010) and SciPy (Virtanen et al. 218 2020), thus resolving the previous licensing issues. This new version provides a GUI for user-219 friendly setting of time constraints, exposes a Python interface for lower-level analysis and 220 maintains support for r8s-formatted input files. 221

222 <u>Analysis</u>

We include several data analysis modules: TaxI2 for calculation of pairwise distances among
individuals, and morphometricanalyzer for basic morphometric analyses (elaborated upon
below). For convenience, we also include simplestatscalculator, a utility for quick, basic
statistical analyses of manually entered or pasted data.

227 **TaxI2** is a tool for pairwise sequence comparison. To analyze DNA barcoding data sets, 228 Steinke et al. (2005) proposed the program TaxI, which performs pairwise alignments between 229 sequences and calculates pairwise distances based on these alignments. Compared to a multiple 230 sequence alignment (MSA) the authors argued that these distance calculations may be more 231 accurate in the case of highly divergent markers including multiple insertions and deletions, such 232 as stretches of mitochondrial ribosomal RNA genes. The pure-Python tool TaxI2 performs 233 similar calculations, with numerous added functionalities such as support for pre-MSA aligned 234 data sets. The tool has two main analysis modes: First, following the original TaxI approach, it

235 can compare a set of sequences against a reference database, via pairwise alignments, identifies

- 236 for each query the closest reference sequence, and calculates various genetic distances among the
- two. Second, it also can perform all-against all comparisons of a set of sequences. In this latter
- approach, sequences can be added in tab-delimited table format along with species name, and
- from these data the program calculates within-species, between-species, and between-genus
- distances. Various metrics and graphs defining the barcode gap in a given data set are also
- included in the output. The program furthermore performs a simple threshold-based clustering ofDNA sequences into OTUs, following the approach previously implemented in TaxonDNA
- 242 DNA sequences into 010s, following the approach previously implemented in TaxonDNA 243 (http://taxondna.sourceforge.net/; Meier et al. 2006), and outputs the resulting species partition as
- 244 SPART file (Miralles et al. 2021)

245 **morphometricanalyzer** is our tool for exploratory analysis of morphometric datasets.

- 246 Integrative taxonomists do not only use molecular data. In many cases, a limited number of one-247 dimensional morphometric measurements such as body length and width (or leaf length and
- 248 width in plants) are taken and compared among groups of individuals. For simple statistical
- analyses, we have included the tool **morphometricanalyzer** which performs a series of
- 250 exploratory routine comparisons from morphometric data. It takes as input tab-delimited text files
- 251 with species hypotheses and a series of other optional categories, and then performs automatically
- a series of statistical comparisons between species (and between other categories), such as
- 253 calculations of means, medians, standard deviation, minimum and maximum values; pairwise
- 254 Mann-Whitney U-tests and Student's t-tests between all pairs of species; a simple Principal
- 255 Component analysis; and calculation of ratios among original values as a means to size-correct
- them, followed by statistical comparison of these size-corrected values. Finally, the program also
- 257 outputs pre-formulated taxonomic diagnoses, with full-text sentences specifying by which
- morphometric value or ratio a species/population differs from other species/populations with
- statistical significance, or without value overlap. It would also be possible to explore non-
- 260 morphological (e.g. bioacoustic) data with this tool, although it is primarily developed for
- 261 morphometrics.
- 262
- 263 <u>Delimitation</u>
- A special emphasis in the first development phase of iTaxoTools is species delimitation, a
- burgeoning field in systematics. The available species delimitation algorithms mostly use DNA
- sequence data and tend to overestimate the number of species in a data set (e.g., Miralles et al.
- 267 2013); indeed, they may delimit populations rather than species (Sukumaran & Knowles 2017).
- 268 Yet, such automated delimitation may play a role in formulating initial species hypotheses that
- 269 can then be tested in an integrative taxonomy pipeline. In the first version of iTaxoTools, we have
- 270 focused on tools already available in Python programming language. For these tools, we added 271 user-friendly GUIs and slightly extended the functionality, for example by enabling them to
- 271 user-mendly GOIs and signify extended the functionality, for example by enabling them to
 272 output species partition information in the standardized "spart" format proposed by Miralles et al.
- 272 output species partition information in the standardized spart format proposed by winanes et al.
 273 (2021). The current version of iTaxoTools includes GUI-enhanced versions of **PTP** (Zhang et al.
- 274 2013) (Fig. 6) and **GMYC** (Pons et al. 2006; Fujisawa & Barraclough 2013; Python version J.
- 275 Zhang) which delimit species from single-locus trees; **tr2** (Fujisawa et al. 2016) and
- 276 **DELINEATE** (Sukumaran et al. 2020) that use coalescence-based approaches on multiple gene
- trees; and **ABGD** (Puillandre et al. 2012) (Fig. 7) and **ASAP** (Puillandre et al. 2020) that are
- alignment-based and rely on calculations of genetic distances. For some of these tools (PTP,
- 279 GMYC, tr2, DELINEATE) the current pre-release GUI versions are still basic and only run under
- 280 default settings; options to change and refine parameters will be added to the first complete

release. iTaxoTools also includes **LIMES 2.0**, a program to handle and compare species

282 partitions obtained by these various approaches (Ducasse et al. 2020, Miralles et al. 2021).

283

284 Diagnosis

285 The diagnosis of new species – rather than its lengthy description – represents the most important 286 part of the alpha-taxonomic process, and in all Nomenclatural Codes, diagnosis can be based on 287 molecular, as well as morphological characters (Renner, 2016). Several software tools have been 288 proposed to extract diagnostic nucleotide positions of clades and species, either phylogeny-based 289 (caos; Sarkar et al. 2008) or primarily alignment-based (MolD, Fastachar, DeSignate: Fedosov et 290 al. 2019; Merckelbach & Borges 2020; Hütter et al. 2020). In order to facilitate the use of such 291 DNA characters in differential diagnoses of new species, we implemented a crucial new tool for 292 DNA taxonomy named **dnadiagnoser**. Compared to other tools, dnadiagnoser has various 293 functionalities to improve the use of DNA characters in species diagnosis. It takes as input tab-294 delimited text files in which one column specifies the unit for analysis (typically the species), and 295 provides as output pre-formulated text sentences which specify (i) in a pairwise fashion, all the 296 diagnostic sites of one species against all other species, and (ii) the unique diagnostic sites (if 297 any) that differentiate a species against all other species. These text sentences can then directly be 298 used in species diagnoses. As a further innovation dnadiagnoser interprets one of the sequences in the input alignment as reference sequence and outputs the diagnostic sites relative to this 299 300 sequence. To facilitate such comparisons, the program also includes a series of standard reference 301 sequences (such as the full Homo sapiens COI or cox1 gene) and allows as input unaligned sequences, which are then pairwise aligned against the reference sequence to identify diagnostic 302 303 positions and label them according to their position in the reference sequence, a procedure that 304 works reliably in sets of sequences with no or only few insertions or deletions such as COI. In 305 addition, we have also programmed a GUI for MolD (Fedosov et al. 2019), a program that is 306 tailored for recovering DNA-based diagnoses in large DNA dataset, and is capable of identifying 307 diagnostic combinations of nucleotides (DNCs) in addition to single (pure) diagnostic sites. The 308 crucial and unique functionality of MolD allows assembling DNA diagnoses that fulfil predefined criteria of reliability, which is achieved by repeatedly scoring diagnostic nucleotide 309 310 combinations against datasets of in-silico mutated sequences.

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313 Future extensions

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315 Our goal with this paper is to make the tools we have developed available to the community 316 as soon as possible so they may be critically evaluated and improved. The next developments will 317 be in three fields: (i) Geography: iTaxoTools will not compete with geographical information 318 systems (GIS), but there are a number of recurrent and rather simple geographical analyses in 319 alpha-taxonomy that can be facilitated by bioinformatic tools, in particular calculation of linear 320 distances among sites and of the surface (minimum convex polygon) of a distribution range of a species, based on a set of georeferenced locality points, and most importantly, a simple graphical 321 322 editor that outputs publication-ready distribution maps, with customizable colors and symbols for different species, from a set of georeferenced locality records. For more sophisticated analyses, 323 324 connecting iTaxoTools (via data formats such as SPART) with dedicated toolboxes for analysis 325 of spatial biodiversity data such as SDMToolbox (Brown et al. 2017) could allow e.g. for 326 comparative niche modelling of alternative species partitions. (ii) Extraction of diagnostic traits from specimen data: Besides molecular diagnosis with MolD and dnadiagnoser, we plan to 327

328 develop a tool that automatically outputs diagnoses based on (specimen-based) categorical data 329 sets of morphological characters. (iii) **Connection to other programs:** We also plan to explore 330 options to connect iTaxoTools to the DELTA (DEscription Language for TAxonomy) software 331 package (Coleman et al. 2010). DELTA is a format for coding descriptive taxonomic information 332 that however is primarily species-based (not specimen-based as iTaxoTools), and a series of 333 programs have been developed on this basis, spearheaded by M. Dallwitz at CSIRO (Canberra, 334 Australia) (Dallwitz 1974, 1980). The new Free DELTA platform launched in 2000 335 (http://freedelta.sourceforge.net/) includes options for editing and maintenance of data sets in 336 DELTA formats, as well as utilities for data conversion, interactive identification of taxa, 337 automated generation of diagnostic keys, and descriptions. Especially, information on species-338 specific molecular and morphological characters identified in iTaxoTools could be seamlessly 339 coded in DELTA, making use of pydelta (http://freedelta.sourceforge.net/pydelta/).

340 The biggest gap in taxonomy software so far is the integrative aspect in the sense of Dayrat's 341 (2005) concept of integrative taxonomy (see also Padial et al. 2010). That is, the many available 342 species delimitation programs all output a species hypothesis based on one analytical approach – 343 usually based on only a molecular data set, with a few exceptions such as iBPP, which can 344 integrate morphometric and molecular data (Solís-Lemus et al. 2015). Approaches that combine 345 information from different lines of evidence into species delimitation are exceedingly scarce. As 346 an example, DELINEATE (Sukumaran et al. 2020) allows the user to fix a series of species 347 hypotheses (i.e., firmly assign a series of specimens to species) while letting the other specimens 348 "float" freely in the analysis and assign them to either one of the previously defined species, or to 349 a new species. Such an option of "prior" species delimitation should be universally available to 350 users as a manual option (e.g., if evidence comes from field or experimental data on 351 hybridization, genomic information, or other data that are vet difficult to code or implement in 352 species delimitation software), similar to what is implemented in DELINEATE. But ideally, 353 automated proposals of firm *a priori* evidence for two specimens to either belong to two species, 354 or to the same species, could also be elaborated by the software - for instance, using evidence 355 such as sympatric geographical occurrence without gene flow, full concordance between genetic 356 and morphological characters, or exceedingly high genetic distances. We plan to develop 357 concepts for such analysis priors, and start implementing them in a iTaxoTools webserver 358 pipeline, in the next years.

359 Importantly, our project is open for other developers to join, and for the taxonomic community as a whole to provide suggestions. We especially welcome proposals of additional 360 tools that could help to streamline and accelerate the whole process of delimiting and naming 361 362 species (whether it concerns the initial step of data acquisition, their treatment, their analyses, or 363 their final submission to a dedicated repository). Only practicing taxonomists know which parts 364 of the alpha-taxonomic workflow for their group of taxa is particularly time-consuming, and where time and effort is lost with repetitive, manual tasks that could be as well automatically 365 366 performed by a computer program – and thereby formulate requirements for such dedicated 367 programs.

368 369

370 Perspectives for iTaxoTools

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372 The different taxonomic tools made available here are performing analyses offline on a local

computer (and in the future will also be available on a webserver), but without linking to external
 resources. True next-generation taxonomy will require linking specimen-based taxonomy

375 software with online resources and databases, and scaling the analyses to data of many thousands

- of specimens. On the one hand, this involves archiving newly acquired data in dedicated
- repositories (Miralles et al. 2020). But on the other hand, it means aggregating for each specimen identifier DNA sequences, morphological characters, images, and increasingly -omics data (e.g.,
- identifier DNA sequences, morphological characters, images, and increasingly -omics data (e.g.,
 Lendemer et al. 2020), and then entering these large-scale cyberspecimen data into species
- delimitation, diagnosis and naming pipelines. The process could be coupled with machine-
- 381 learning programs to automatically extract diagnostic traits e.g. from images, with data
- 382 aggregators such as GBIF (gbif.org) and online tools such as Map of Life (mol.org), or Timetree
- 383 of Life (timetree.org) to obtain geographical and temporal context, and distribution models for
- 384 alternative species hypotheses. These bioinformatic opportunities may gain power under a view
- of species as probabilistic hypotheses that may allow defining probability thresholds of
- integrative taxonomic analysis above which lineages can be confidently named as species by
- 387 semi-automated pipelines. While the current version of iTaxoTools is far from this vision, it may
- 388 represent a seed for developing the necessary environment, and a sandbox to test software tools
- 389 with the potential to significantly accelerate the inventory of life.
- 390 391

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392 393

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583 **TABLE 1.** Overview of the software tools and functionalities currently included in the 0.1

version of iTaxoTools. The majority of the tools can be run (i) command-line driven in Python,

and is distributed as (ii) a standalone executable (.exe) file, (iii) as part of a full package with

586 launcher window (Fig. 1) in a single executable or part of a folder, and (iv) all tools will

587 furthermore be implemented on a webserver. Note that functionalities for pre-existing species

588 delimitation tools are explained in more detail in the original papers.

- 589
- 590

Tool	Purpose	Main functionalities
dnaconvert	Converts among DNA	- Supports typical sequence formats (fasta, fastq, phylip, nexus)
	sequence formats	- Autocorrects typical errors in sequence files such as non-standard
		characters in sequence names.
		- Reads GenBank flat files and converts from and to tab-delimited
		files to manage sequence in spreadheet editors.
		- Single-file conversion, batch conversion and conversion of copy-
		pasted files
latlonconverter	Converts among different	- Parses a large variety of formats of WGS84 geographical
	geographic coordinate formats	coordinates
		- Batch-conversion of coordinates in tables or copy-pasted lists which
		can contain coordinates in different formats (recognized by heuristic
		approach)
		- Main output in decimal degree format
fastmerge	Merges DNA sequence files	- Can merge large /definition?/ files that usually cannot be opened in
-	(fasta, fastq)	editors.
		- Works for any text file but includes additional features when
		processing fasta and fastq.
		- Allows for filtering sequences and sequence names with certain
		motifs and include/exclude them in the merged file
fastsplit	Splits (large) DNA sequence	- Can split large files /definition?/ that usually cannot be opened in
	files (fasta, fastq) into smaller	editors and split them into a series of equally sized smaller files
	files	- Designed for fasta and fastq, but works for any text file.
		- Allows for filtering sequences and sequence names with certain
		motifs and include/exclude them in the split files
specimentablepruner	Removes rows from tables	- Takes as input a tab-delimited file and a series of values of
1 1	based on a list of values for the	specimen identifiers
	row "specimen"	- Removes all rows from the table where the column "specimen" (or
	1	other chosen column) agrees with any of the provided values
specimentablemerger	Merges data from two tables	- Takes as input two or more tab-delimited files, compares values in
1 0	based on values in the row	column "specimen" (or other chosen column) and merges into one
	"specimen"	table, combining values for same specimen number in the same row
		- Automatically checks for duplicate values of the same variable and
		specimen and issues warnings
linebreaker	Changes among line break	- Takes as input any text file and changes all line breaks to the
	formats (Unix, Windows, Mac)	specified format
simplestatscalculator	Performs a series of basic	- Values are typed or pasted into text boxes
1	statistical analyses based	- Descriptive statistics (mean, median, standard deviation and others)
	manually entered data	- Pairwise comparisons (t-test, U-test)
	5	- Comparisons of distributions (Chi-square, normality, Fisher's)
		- Corrections for multiple testing
unitconverter	Converts among different units	
unitconverter	Converts among different units	- Values are typed into into one field, all other fields show converted
unitconverter	Converts among different units	- Values are typed into into one field, all other fields show converted values in real time
unitconverter	Converts among different units	- Values are typed into into one field, all other fields show converted
		 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others
unitconverter spartmapper	Computes a kml file from	 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others Takes as input a text file with decimal geographical coordinates and
	Computes a kml file from geographical coordinates and	 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others Takes as input a text file with decimal geographical coordinates and specimen identifiers, and a species partition (spart) file
spartmapper	Computes a kml file from geographical coordinates and spart file	 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others Takes as input a text file with decimal geographical coordinates and specimen identifiers, and a species partition (spart) file Outputs a kml file to show localities by species on Google Earth
	Computes a kml file from geographical coordinates and spart file Removes special characters	 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others Takes as input a text file with decimal geographical coordinates and specimen identifiers, and a species partition (spart) file Outputs a kml file to show localities by species on Google Earth Takes as input a Newick treefile, identifies node names, searches for
spartmapper	Computes a kml file from geographical coordinates and spart file	 Values are typed into into one field, all other fields show converted values in real time Separate tabs for conversion of distance, volume, time, molarity, and others Takes as input a text file with decimal geographical coordinates and specimen identifiers, and a species partition (spart) file Outputs a kml file to show localities by species on Google Earth

	(chronograms) based on non- parametric rate-smoothing	 Transforms into ultrametric using non-parametric rate smoothing, without the need to access original data (sequences) User-friendly interface to set time constraints (calibrations) on nodes.
TaxI2	Calculates inter- and intraspecific distances and the barcoding gap based on pairwise-aligning DNA sequences	 Takes as input aligned or unaligned sequence files in fasta or tab- delimited text format For unaligned sequences, pairwise alignment are performed Calculates pairwise genetic distances among all sequences If tab file contains row with species names, inter- and intra-species distances are calculated and summarized, and the barcoding gap as well as some summary statistics of the barcoding gap calculated inter-species distances are separately calculated for species of the same genus vs. different genera A histogram with illustrating the barcoding gap is produced in editable PDF format
morphometricanalyzer	Calculates a series of basic statistical comparisons of species based on morphometric data	 Takes as input tab-delimited files with morphometric measurements (continuous variables) Allows specifying if analyses should be done by species, by sex/stage, or by species and sex/stage Calculates summary statistics, pairwise comparisons (t-tests, U-tests), ANOVAs, PCA and DA Size-corrects values by calculating ratio against a reference measurement such as body size Outputs boxplots and scatterplots of PCA and DA factors, by species and/or sex/stage in editable PDF format Writes text output summarizing diagnostic characters (scientifically different measurements between species, with and without overlap of ranges)
dnadiagnoser	Computes diagnostic sites for species from DNA sequences	 Takes as input aligned or unaligned sequence files in fasta or tab- delimited text format Unaligned sequences are pairwise aligned to reference sequence and differences recorded relative to position in reference Summarizes variation within species and outputs diagnostic sites among species Outputs unique diagnostic sites for the whole data sets, as well as diagnostic sites in pairwise comparisons among species Output is given in the form of tables but also as text which can be used for species diagnoses in taxonomic papers
РТР	Species delimitation based on Poisson tree processes	 Uses as input a non-ultrametric tree with branch lengths (phylogram) tree in Newick or Nexus format Models speciation on branching events in terms of number of mutations (inferred from branch lengths) Bayesian and ML versions of PTP are implemented
GMYC	Species delimitation based on the Generalized Mixed Yule Coalescent	 Uses as input an ultrametric tree in Newick or Nexus format Uses a likelihood approach to analyse the timing of branching events, seeking for significant switches between a Yule (interspecific) and a coalescent (intraspecific) branching structure.
tr2	Species delimitation using Bayesian model comparison and rooted triplets	 Takes as input a set of gene trees, and optionally a guide species tree Calculates posterior probability scores for user-specified delimitation hypotheses. Alternatively, finds the best delimitation under a guide tree specifying a hierarchical structure of species grouping.
DELINEATE	Species delimitation by integrating an explicit model of speciation into the multipopulation coalescent	 Takes as input a rooted ultrametric tree from a multispecies coalescent analysis, in Nexus or Newick format Second input file is a table assigning specimens to species, or flagging their species identity as unknown Outputs various alternative species partitions, ranked by probability
ABGD	Species delimitation by automatic barcoding gap discovery	 - Takes as input a set of aligned sequences and calculates pairwise distances - Uses a coalescent model to identify the position of the most likely barcode gap, based on a maximal genetic intraspecific divergence defined a priori by the user. - Uses the DNA barcoding gap to propose species partitions.

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ASAP	Species delimitation from	- Takes as input a set of aligned sequences and calculates pairwise
	single-locus sequence data by	distances
	the Assemble Species by	- Proposes species partitions ranked by a new scoring system that
	Automatic Partitioning	uses no biological prior insight of intraspecific diversity.
	approach	
LIMES 2.0	Compare species partitions by	- Reads species partition (spart) files, as well as species partition
	different indexes and	information in spreadsheet format
	parsing/merge/export spart files	- Computes C _{tax} ,mC _{tax} ,R _{tax} and Match Ratio indexes
		- Can merge, extract and export spart files
MolD	Recovers DNA-based	- recovers diagnostic combinations of nucleotides (DNCs) for pre-
	diagnoses for taxa from DNA	defined groups of DNA sequences, corresponding to taxa
	sequence alignments	- Identifies pure diagnostic sites, minimal DNCs (mDNCs), and
		redundant DNCs (rDNCs), the latter fulfil predefined criteria of
		reliability

TABLE 2. Repositories of the code of the tools included in the 0.1 version of iTaxoTools. The

table also lists the main programmers involved in the development of each tool or its graphical

597 user interface (GUI), and informs whether a tool was newly programmed for this project, adjusted

598 from existing code (by adding a GUI plus sometimes additional functionalities), or included as

599 original code and GUI without modification.

Tool	New / Adjusted / Original	Github repository (original / modified)	Main programmers (original program) / GUI
dnaconvert	New	https://github.com/iTaxoTools/DNAconvert	V. Kharchev
latlonconverter	New	https://github.com/iTaxoTools/latlon-converter	V. Kharchev
fastmerge	New	https://github.com/iTaxoTools/fastsplit-merge	V. Kharchev
fastsplit	New	https://github.com/iTaxoTools/fastsplit-merge	V. Kharchev
specimentablepruner	New	https://github.com/iTaxoTools/specimentablepruner	V. Kharchev
specimentablemerger	New	https://github.com/iTaxoTools/specimentablemerger	V. Kharchev
linebreaker	New	https://github.com/iTaxoTools/linebreaker	S. Kumari
simplestatscalculator	New	https://github.com/iTaxoTools/simple_stat	S. Kumari
unitconverter	New	https://github.com/iTaxoTools/UnitConverter	S. Kumari
spartmapper	New	https://github.com/iTaxoTools/linebreak_replacer	S. Kumari
nodenamecorrector	New	https://github.com/iTaxoTools/nodenamecorrector	V. Kharchev
pyr8s	New	https://github.com/iTaxoTools/pyr8s	S. Patmanidis
TaxI2	New	https://github.com/iTaxoTools/TaxI2	V. Kharchev
morphometricanalyzer	New	https://github.com/iTaxoTools/morphometricanalyzer	V. Kharchev
dnadiagnoser	New	https://github.com/iTaxoTools/dnadiagnoser	V. Kharchev
PTP	Adjusted	https://github.com/zhangjiajie/PTP	(J. Zhang)
		https://github.com/iTaxoTools/PTP-PYQT5	GUI: S. Kumari
GMYC	Adjusted	https://github.com/zhangjiajie/pGMYC	(J. Zhang) GUI: S. Kumari
tr2	A	https://github.com/iTaxoTools/GMYC-PYQT5	
tr2	Adjusted	https://github.com/tfujisawa/tr2-delimitation-git	(T. Fujisawa) GUI: S. Kumari
DELINEATE	Adjusted	https://github.com/iTaxoTools/pyqt5-tr2 https://github.com/iTaxoTools/pyqt5-delineate	(J. Sukumaran) GUI: S. Kumari
ABGD	Adjusted	https://bioinfo.mnhn.fr/abi/public/abgd/	(S. Brouillet)
		https://github.com/iTaxoTools/ABGDpy	GUI: S. Patmanidis
ASAP	Adjusted	https://bioinfo.mnhn.fr/abi/public/asap/	(S. Brouillet)
		https://github.com/iTaxoTools/ASAPy	GUI: S. Patmanidis
LIMES 2.0	Original	https://github.com/iTaxoTools/LIMES	J. Ducasse
MolD	Adjusted	https://github.com/SashaFedosov/MolD	(A. Fedosov)
		https://github.com/iTaxoTools/MolD_pyqt5	GUI: S. Kumari

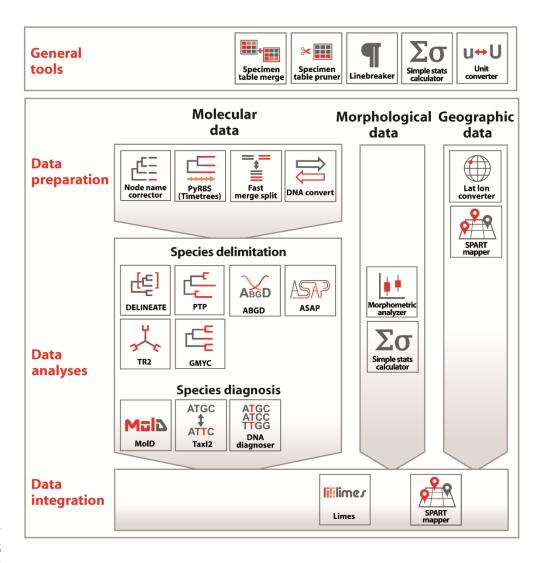


FIGURE 1. Overview of the various tools implemented in iTaxoTools, and their scope. In the 612 present version a focus is on molecular data analysis, but more functionalities to analyze and

613 visualize morphological and geographic data will be implemented in the next future, while data

614 integration remains the main focus for long-term implementation.

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R iTaxoTools Help About Links	<u>_ </u>
iTaxoTools Bioinformatic tools for integrative taxonomy	
Quick Tools Morphology Species Delimitation Diagnosis/DNA barcoding	
GMYC TR2 DELINEATE ABGD	
PTP V SODA V 96 ATGC Threshold duster ASAP V	
Limes	

- **FIGURE 2.** Main launcher window of iTaxoTools 0.1 with the option to start various species
- 622 delimitation tools (additional tools can be started from the other tabs).

624 625 626	
020	DNAconvert
	DNAconvert A versatile DNA sequence format converter DNAconvert code by Vladimir Kharchev: https://github.com/iTaxoTools/DNAconvert
	Input File Output File
	Browse Convert Browse
	Browse input directory Allow empty sequences
	(for batch conversions) Check to disable automatic renaming
	Input Format (may result in duplicate sequence names Output Format in Phylip and Nexus files)
	fasta Tab Tab
	Instead of specifying an file name, your data can also be pasted (recommended only for small data sets) >LR230_16SAL CTAGCCTGCCAGTGACTAAGTTTAACGGCCGCGGTACCCTAAC CGTGCAAAGGTACCACATCACTTGTTCTTTAAATGAGGACCAG AATCAACGGCACCACGAGGATCCCACTGTCTCCCCCCTCCAATC AGTGAAACTGATCTCCCCGTGAAGAAGCGGGGGATAAAGATATAA GACGAGAAAGACCCCACGAGGATCCCAACAACACCCCACTT ATTTTTATCCACCACTTAAATTAG-GGCCTGTTTGCTIGGTTTTA GGTTGGGGTGACCACGAGTACCAAAAACCACCCACTT ATTTTTATCCACCACTTAATTAG-GGCCTGTTTGCTIGGTTTTA GGTTGGGGTGACCACGAGTACCAACACCCCACTGAAGAAAG GACTGAAAATCCTTATTAAGGAGCACCAGGTACCAAGAACCCCCACGAGGAAG GACTGAAAATCCACACTTGATCAACGAACCAACACCCCACTT ATTTAACTTTTAATGACCCACCATTGATCAACGAACCAAGTTAC CCTCGGGGATAACGGCCGCGATCCACCTTGAGAGAACCAAGTTAC ACTTTAATTAACTTTTAATGACCCACCTTGATGAACGAAC
627	

628

629

630 **FIGURE 3.** Screenshot of one of the newly programmed quick conversion tools, DNAconvert,

which implements numerous autocorrect options to avoid sequence output files generating errors

632 in downstream programs. DNAconvert also supports tab-delimited table input and its conversion

to common sequence formats such as FASTA, NEXUS, or PHYLIP, to facilitate storage and

634 management of sequences and sequence metadata in spreadsheet editors such as Microsoft Excel.

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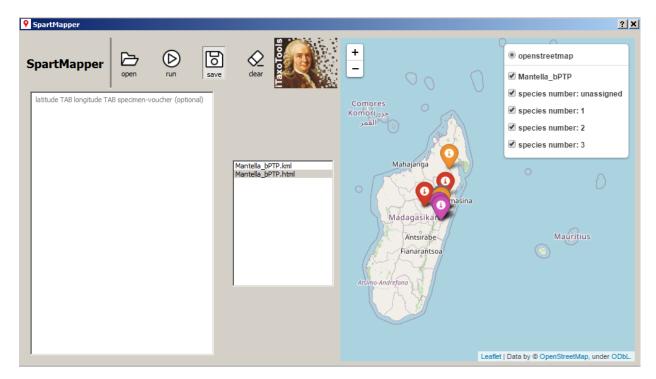


FIGURE 4. Screenshot of spartmapper, a tool that plots distribution records from geographical

640 coordinates on a map and categorizes the records based on a species hypothesis provided as
 641 SPART file (Miralles et al. 2021). The program allows live view and produces a kml file to

642 visualize the records in Google Earth or Google Maps.

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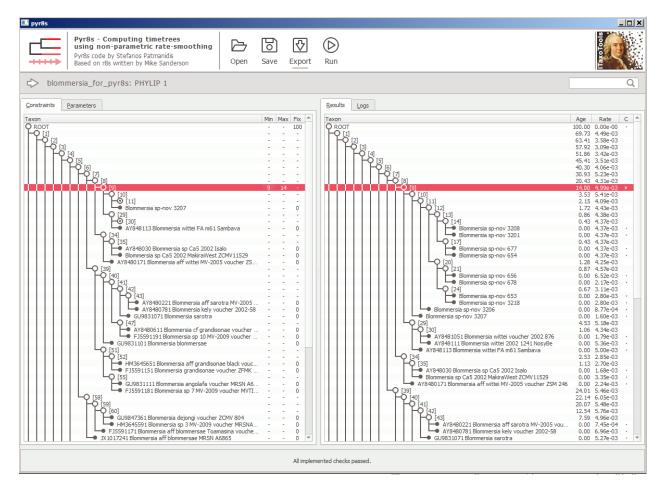


FIGURE 5. Screenshot of pyr8s after running an analysis and converting a tree into an

ultrametric timetree. The red-highlighted row marks a node for which age constraints had beenset before the analysis.

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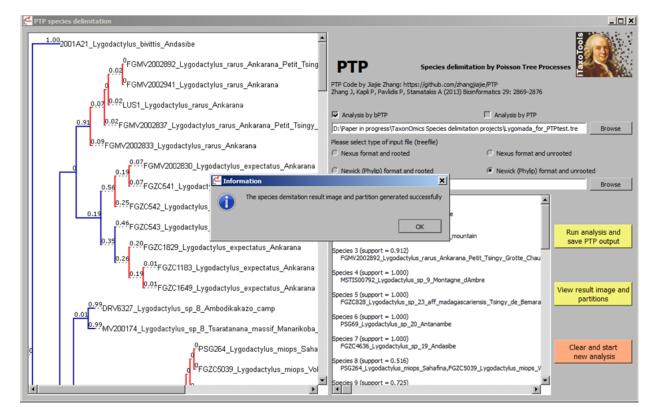
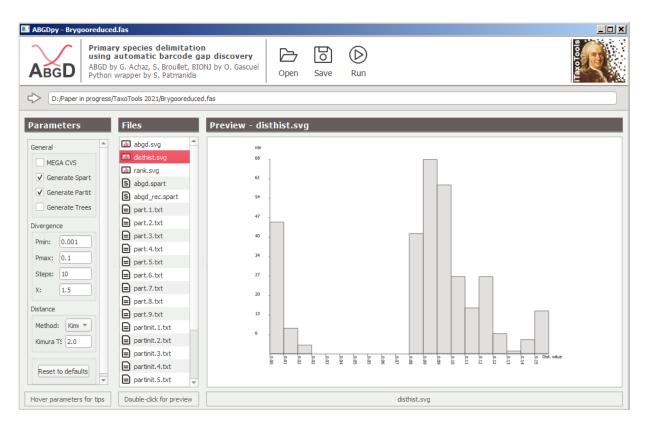


FIGURE 6. Screenshot of the GUI-based version of PTP, a program that delimits species from non-ultrametric trees. The original Python code of PTP was written by Zhang et al. (2013);

iTaxoTools adds the GUI, as well as functionality to export species partition in the SPART
 format (Miralles et al. 2021).

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667 668

669 FIGURE 7. Screenshot of the GUI-based version of ABGD, a program that delimits species by

670 detecting the barcoding gap from pairwise single-locus sequence distances (Puillandre et al.

671 2012). For this tool, the original ABGD code written in C was wrapped with a Python GUI and

672 compiled as standalone executable. The different output files produced by ABGD (text and

- 673 graphs) can be selected and pre-viewed within the GUI.
- 674

675