ACADEMIC PRACTICE IN ECOLOGY AND EVOLUTION

Metadata Made Easy: Develop and Use Domain-Specific Metadata Schemes by following the dmdScheme approach \circ

Rainer M. Krug 问 | Owen L. Petchey 问

Department of Evolutionary Biology and Environmental Studies, University of Zürich, Zurich, Switzerland

Correspondence

Rainer M. Krug, Department of Evolutionary Biology and Environmental Studies. University of Zürich, Winterthurerstrasse 190, 8057 Zurich, Switzerland. Emails: Rainer.Krug@uzh.ch; Rainer@Krugs.de

Funding information

Schweizerischer Nationalfonds zur Förderung der Wissenschaftlichen Forschung, Grant/Award Number: 310030 188431; University Research Priority Programme Global Change and Biodiversitv

Abstract

1. Metadata plays an essential role in the long-term preservation, reuse, and interoperability of data. Nevertheless, creating useful metadata can be sufficiently difficult and weakly enough incentivized that many datasets may be accompanied by little or no metadata. One key challenge is, therefore, how to make metadata creation easier and more valuable. We present a solution that involves creating domain-specific metadata schemes that are as complex as necessary and as simple as possible. These goals are achieved by co-development between a metadata expert and the researchers (i.e., the data creators). The final product is a bespoke metadata scheme into which researchers can enter information (and validate it) via the simplest of interfaces: a web browser application and a spreadsheet.

Ecology and Evolution

WILEY

- 2. We provide the R package dmdScheme (dmdScheme: An R package for working with domain specific MetaData schemes (Version v0.9.22), 2019) for creating a template domain-specific scheme. We describe how to create a domain-specific scheme from this template, including the iterative co-development process, and the simple methods for using the scheme, and simple methods for quality assessment, improvement, and validation.
- 3. The process of developing a metadata scheme following the outlined approach was successful, resulting in a metadata scheme which is used for the data generated in our research group. The validation quickly identifies forgotten metadata, as well as inconsistent metadata, therefore improving the quality of the metadata. Multiple output formats are available, including XML.
- 4. Making the provision of metadata easier while also ensuring high quality must be a priority for data curation initiatives. We show how both objectives are achieved by close collaboration between metadata experts and researchers to create domain-specific schemes. A near-future priority is to provide methods to interface domain-specific schemes with general metadata schemes, such as the Ecological Metadata Language, to increase interoperability.

This is an open access article under the terms of the Creative Commons Attribution License, which permits use, distribution and reproduction in any medium, provided the original work is properly cited.

© 2021 The Authors. Ecology and Evolution published by John Wiley & Sons Ltd.

Ecology and Evolution

-WILEY

1 | INTRODUCTION

To define a kind of gold standard for data handling, Wilkinson et al. (2016) developed the FAIR data principles. These define principles to make the data Findable, Accessible, Interoperable, and Reusable and help to assess data handling workflows in regard to openness.

There are multiple reasons why data should be widely reusable (Bishop & Kuula-Luumi, 2017; Heaton, 2008; Pasquetto et al., 2017). Widely reusable means that anyone making reasonable efforts could reuse the data and that this would be the case even if the data creator(s) are unavailable. "Anyone" includes the creator(s) of the data, other members of the creating research group, and any other researcher. Use cases include using data from previous experiments to plan new ones, reanalyzing data using different or new preprocessing or analytical approaches to either compare different methodologies (Dufour & Richard, 2019) or to address new scientific aspects (e.g., the use of trait databases Schneider et al. (2019)), metaanalyses (e.g., Culina et al., 2018; Zimmerman, 2008), reproduction of the studies, and use of data for teaching and training (e.g., Atenas and Havemann (2015); or Henty (2015)).

In order to being able to reuse data, it needs to be findable, it needs to be understandable why it was collected and how it was generated, it needs to be understandable which datasets are which, it needs to be understandable which variables contain what information, and relationships among variables must be specified (e.g., Gregory et al., 2019, 2020; Zimmerman, 2007, 2008). All this information should be stored in metadata; thus, metadata are essential for reuse (Gregory et al., 2020; Zimmerman, 2007). Furthermore, interoperability (the I of FAIR) requires standardized metadata schemes.

Metadata schemes have been developed which aim at providing a standardized structure and vocabulary to be used when providing the metadata. Examples of these schemes are the (meta)data standard Darwin Core (Darwin Core task group, 2014, for the current version please see http://rs.tdwg.org/dwc/) and the metadata standard Ecological Metadata Language (short EML) (Jones et al., 2019) in the field of biology/ecology, or more broadly Dublin Core ('Dublin Core', 2020). Interoperability is essential for research that relies on combining different datasets and is particularly important for data-based interdisciplinary research as this very often combines data from different sources.

Given such important reasons for accompanying data with appropriate metadata, why do numerous datasets recently published not include useful metadata (Roche et al., 2015)? To have the metadata available requires the producer of the data to provide it. Therefore, the answer to the question of why many datasets are deposited without rich metadata is that the data creators have not prioritized creating rich metadata. There is some interest and some level of prioritization (e.g., Campbell et al. (2018) showed that especially early career researcher are participating in curating and sharing their data and metadata), but the uptake needs to be accelerated. A critical question that follows is how to motivate the creation and deposition of appropriate metadata. There are multiple possible answers; one that we focus upon is that creating metadata is not easy and creating metadata that conforms to a specific scheme is daunting and difficult for researchers. These schemes are relatively complex, as they are not specific to a research domain (see glossary for definition of "research domain"), but rather for a broad field. An example is the EML metadata scheme (Jones et al., 2019) which caters for earth and environmental science, while for domains in this field, not all properties of the EML scheme might be applicable. The advantages of being applicable to a broad field of science (e.g., consistent search across a range a wider range of domains, standardized property names, and vocabulary for metadata provision, interoperability) comes with the cost of being somewhat complex and rather difficult to understand, which could represent a significant barrier to use by research scientists not working in the field of metadata development.

Our aim was to make the processs of creating metadata not only easy, but also useful for the researcher that created the data and, if at all possible, a quite pleasurable experience to create. We follow the suggestion of Poisot et al. (2019), that domain-specific metadata schemes (small and purpose-built schemes) can be part of the solution to make ecological data easier to find and reuse. The example we use to illustrate a domain-specific metadata scheme is from the research domain we term "Experimental Microbial Ecology" (e.g. Worsfold et al., 2009; Pennekamp et al., 2017; Altermatt et al., 2015) (hereafter EME). We chose this domain because of our familiarity with it and the fact that the data involved can be quite complex. Many measurements are often taken using different methods. Multiple treatments are often applied. Numerous taxa are often involved. Various steps of data processing are required to obtain analysis-ready data (e.g., see Garnier et al., 2020; Pennekamp et al., 2017) from the measured raw data. The methods used can create large amounts of data (several terabytes). Therefore, EME is a sufficiently complex domain to be used as an illustration.

In this paper, we present as a case study the experience and results of our research group in developing the EME domain-specific metadata scheme. We first used the R package dmdScheme (Krug & Petchey, 2019a) to create a template domain-specific metadata scheme and then customized the template scheme to create the EME scheme (emeScheme (Krug & Petchey, 2019b). We end with a discussion on how these domain-specific metadata schemes can be integrated into larger metadata schemes by using the example of EML (Jones et al., 2019).

The content of this article focuses on presenting the approach by which a domain-specific metadata scheme can be created using the dmdScheme (Krug & Petchey, 2019a) R package, and its advantages in bringing domain-specific metadata schemes to more domains and to facilitate the provision of rich and quality assured metadata. This article is supported by two Vignettes: one describes the dmdScheme and is aimed at developers of new domain-specific schemes and at users interested in a more detailed description of the package. The other vignette is aimed at users of the emeScheme and could be modified for users of other domain-specific schemes. Both are included in the Supplementary information of this article; updated versions are within the respective R packages.

2 | RELEVANT FEATURES OF GOOD METADATA SCHEMES

Standards: A general consideration when developing domainspecific metadata schemes, has to be to prevent the proliferation of a multitude of schemes, risking little or no interoperability among domains. To increase interoperability, each domain-specific scheme should be as much as possible linked formally to standardized metadata schemes. A domain-specific metadata scheme can be an easy-to-use interface to a more general and standardized metadata scheme. The approach described in this paper, the dmdScheme approach, contains infrastructure which can facilitate this. Further aspects are discussed in detail below. Three other features of domain-specific metadata schemes can increase motivation of researchers to use them: **co-development**, **ease of use**, and **data/ metadata validation**.

Co-development by metadata experts and researchers in respective domains ensures that the scheme can be shaped by providing input to identify essential properties to be included in the metadata, and to exclude nonessential metadata. The goal then is to create a domain-specific metadata scheme that fits that domain. Co-development not only results in a better product, but the resulting "ownership" of these schemes by researchers is likely to increase motivation to use them, to advertise them, to provide input for further development, and to include them in teaching and training.

Easy metadata entry is highly desirable. It should not be technically difficult, and presumably the easier the better. To accomplish these design goals, we made a metadata entry system that includes only a web browser-based application and a spreadsheet. The simplicity of these interfaces should keep the additional workload for the researchers as small as possible. Moreover, these methods of metadata entry can be common across domains, meaning that it is not necessary to teach or learn a different tool for each domain. Previously developed applications for easy metadata entry include Morpho, a data management tool for earth, environmental, and ecological scientists (https://knb.ecoinformatics.org/tools/morpho). It is not maintained anymore and has not seen any activity for the last 5 years (https://github.com/NCEAS/morpho). Nevertheless, it is open source and could be developed further by all interested parties. Unfortunately, we did not manage run it, presumably due to incompatibilities with the java versions required that we were unable to resolve. Therefore, we were not able to compare its feature set with the here presented approach.

Validation of data and metadata can help researchers increase the quality of their data and metadata, for example, by checking that variables in datasets contain the information they should and that they correspond to the stated experimental treatment and observations. Most large metadata schemes provide mechanisms for validating the metadata (e.g., EML in the R package EML (Boettiger & Jones, 2019)). These validations assess mainly the syntactical correctness of the metadata, for example, if all required fields are provided and if numerical values are in the allowed range (if ranges are specified). More detailed (contextual and contentual) validation can be provided for more specific situations or for smaller domains of research, that is, for domain-specific metadata schemes.

The aim of a domain-specific metadata scheme would be to fulfill all of these four features. Nevertheless, in some cases it will not be possible to fulfill all without compromises which are not acceptable for the aim of developing specific schemes. This becomes apparent when considering a domain for which very specific use metadata is needed which cannot be linked to any larger metadata scheme. In this case, one should aim at linking the discovery metadata to a general scheme while keeping the use metadata unlinked. If both can be mapped, the domain-specific metadata scheme would be a frontend to provide metadata following a larger metadata standard, using terminology the researchers are familiar with.

3 | The Template dmdScheme PACKAGE

The R package dmdScheme (Krug & Petchey, 2019a) forms the core of developing and using domain-specific metadata schemes following the dmdScheme approach. It is normally hidden for the researcher/user of the domain-specific metadata schemes and mainly of concern for the actual developer or power user of new metadata schemes.

The package contains all the base functionality needed to develop a new domain-specific metadata scheme. It includes functionality to create a spreadsheet for entering the domain-specific metadata, functionality to read the metadata from that spreadsheet, basic validation functions, and export functions to xml and templates needed to implement the export to EML. It is important to note, that the dmdScheme package itself should not be used to enter actual metadata. It only contains a template for a metadata scheme.

How to develop a new scheme and how to use the package is explained in detail in the accompanying vignette Develop and Use the dmdScheme which is included in the supplemental material of this article.

A second part of the dmdScheme approach is a repository of domain-specific schemes (Krug, 2020). Here, any developed domain-specific schemes can be deposited. The R package dmdScheme contains functionality to load the selected scheme from this repository and installs the accompanying R package in a temporary library. This arrangement makes it possible to use the scheme not only together with the R package dmdScheme, but also in other programming languages, if so desired.

4 | CREATING A DOMAIN-SPECIFIC METADATA SCHEME

4.1 | Creating the emeScheme

The scheme emescheme (Krug & Petchey, 2019b) was developed based on the dmdScheme (Krug & Petchey, 2019a) and is tailored for data from Experimental Microbial Ecology. The motivation to

Ecology and Evolution

develop this metadata scheme was born out of the realization that for long-term storage and retrieval following the FAIR data principles, metadata and data format standards are needed to be able to find and retrieve the data at any later stage and to be able to reuse it, even in the own research environment. Therefore, it was decided to develop a rich metadata scheme which would provide enough metadata to be able to find the data and to reuse it.

As discussed in the Introduction section, interoperability across domains requires common cross-domain metadata schemes. The dmdScheme package already contains the basic structures to provide an export to EML xml format. But one of the basic requirements of doing so is linking of the domain-specific metadata properties to, in the case of the emeScheme, the EML properties. Hence, considerations in the drafting of the emeScheme (Krug & Petchey, 2019b) and some additional constraints (i.e., only one measurement and extraction method per data file), make it possible to translate the emeScheme metadata into EML (The export into EML is planned for the next major release of the emeScheme package.).

If in the development of a new dmdScheme the larger metadata scheme is kept in mind, it is possible to use all the functionalities of the package dmdScheme as a frontend for providing metadata which is compliant with larger, more complex, metadata schemes. In the same way, other large metadata schemes could be used as the framework for the domain-specific metadata schemes. This would bridge the gap between simple to understand domain-specific metadata schemes on the one side and complex and difficult to understand but applicable to a large range of different domains metadata schemes.

An open exchange between the researchers and a programmer developing the scheme was essential in turning the emeScheme into a domain-specific metadata scheme which will be used by researchers to create their metadata. Researchers were involved in the process of developing the emeScheme from the beginning. This included regular meetings to identify properties in the scheme which are missing, redundant, or not needed. Finally, the researchers were the first testers of the metadata scheme.

The process of developing the emeScheme involves the following steps:

- Definition of objectives by researchers and developer. This included the objective of FAIR compliance, but also ease of use and validation functionality.
- Creation of a first version of the scheme by the developer. Entering, by researchers, data from a set of diverse experiments within the domain. The diversity of experiments is important, as different experiments may require different metadata properties and even structures.
- Discussion among researchers and developer experiences entering the metadata, highlighting missing, redundant, or not needed properties in the scheme, etc.

4. Revision of the scheme by the developer and return to step 2.

5. Finalizing and publishing the scheme definition package.

Based on initial discussions, the scheme included information about the experiment itself as well as about the different data sets resulting from different measurements and analysis methods as well as treatments during the experiment. This information about the experiment is valuable contextual metadata. To simplify the provision of the metadata and to avoid duplication of the experimental metadata, all metadata would be entered into one spreadsheet file (with multiple sheets), with any required assignment of metadata to individual datasets done automatically in the final stage of the metadata export.

This iterative process resulted in the spreadsheet <code>emeScheme.xlsx</code> (Figure 1 and Supplemental Material).

This scheme was then bundled together with additional examples and uploaded to the dmdScheme repository as emeScheme version 0.9.9 (Krug & Petchey, 2019b).

4.2 | Enhancing the validation

Even though the package dmdScheme already contains a validation function, the validation is generic and mainly structural. The same applies for the export to xml, which only exports to a single xml file. Additional functionality in the emeScheme, that is, the contextual and contentual validation and the export of the metadata into one xml file per data file, is included in an accompanying emeScheme R package (Krug & Petchey, 2019b).

Validation means the checking of the internal consistency of the metadata, compliance with the allowed and suggested values and types of the metadata as well as against the structure of the actual data files. This validation produces an html (see Figure 2), docx, or pdf report, which shows errors, warnings, or notes. Errors, warnings, and notes represent different levels of severity of detected faults or inconsistencies in the metadata. For example, if a value is not in the list of allowed values, it will result in an error, while if it is not in the list of suggested values, a note will be produced. The validation in the emeScheme package includes aspects not incorporated in the mainly structural and syntactical validation in the dmdScheme package. Therefore, it was necessary to write a new validation function to add the new validation rules, that is, the validation of the structural metadata which concerns the data files and its columns.

When the validation has completed without errors, the metadata can be exported to one xml file per data file. As in the package dmd-Scheme, the export to xml creates a single xml file, and we needed one xml file per data file, a new export function was included in the accompanying R package.

FIGURE 1 Two example sheets (Experiment and Species) in the emeScheme metadata file of the 'emeScheme' spreadsheet. The complete spreadsheet can be found in the supplemental material 'emeScheme.xlsx'

•	🔴 🔵 🛛 Aut	oSave OFF	• •	• 🛃 🗧	ר יΩ ב	🔤 emeSchei	me ~				ର 🛓
н	ome Insert	Draw Pa	ge L	ayout	Formulas I	Data Review	Viev	v 🄉 Tell me		🖻 Share	Comments
	A	В	С	D		E		F		G	6
1	propertySet	valueProperty	unit	type	suggestedValues			Description		DATA emeSche	me v1.0.0
2	Experiment	<u>name</u>		character				The name of the	e experiment.	ASR-expt1	
3		temperature		character	treatment, in degrees	s celsius, measurement	t	Temperature treatments. If diff treatments, use " specify in the Tre	used for all ferent between treatment" and eatment sheet.		20
4		<u>light</u>		character	treatment, light, dark	, cycle , e.g. 16:8 LD		Light used for all different between "treatment" and Treatmen	treatments. If treatments, use specify in the t sheet.	semi-ambient	
5		<u>humidity</u>		character	treatment, relative hu	midity in %		Humidity used for different between "treatment" and Treatment	all treatments. If treatments, use specify in the t sheet.	ambient	
6		incubator		character	none, bench			What type of incu	ubator is used.	not given here	
7		<u>container</u> microcosmVolume	ml	numeric				Volume of the container. Not the culture m	microcosm volume of the edium!	Duran type bottle, red le	100 100 100
9		mediaType		character						PPM	
10		mediaConcentration	g/l	numeric				Conditions of the	outures for all	dirby	0.55
11		cultureConditions		character	axenic, dirty, clean			treatme	ents.	Carty	
12		<u>comunityType</u>		character	treatment, single trop	hic level, multiple trop	hic level	Characterisation commu	of the microbe unity.	initially unknown	
13		mediaAdditions		character						Wheat seeds added on wheat_seed_additions.c	specific dates, see file sv
14		duration	days	integer				Length of the exp This should onl time in wh measurements	eriment in days. y include the hich the were taken!	100	
15		comment		character				Additional fea Experiment you v	tures of the vant to provide	NA	
4	► DOC	UMENTATION	M	dBibliom	etric MdAut	hors Experir	nent	Species	Treatment	Measurement	Da 🕇
											+ 100%

•	😑 😑 🛛 AutoSave 🕯	🚥 🏠 🖬 🐼 🗧	ר יע 🗧 🖻 י	emeScheme 🗠				Q 🛃
н	ome Insert Dr	aw Page Layout	Formulas Data	Review View	> Tell me		🖻 Share	Comments
	A	В	С	D	E	F	G	н
1	propertySet	Species						
2	valueProperty	speciesID	name	strain	source	density	Tunctionarci	<u>comment</u>
3	unit					cells / ml		
4	type	character	character	character	character	character	character	character
5	suggestedValues					treatment	bacteria, bacterivore, predator, phototroph	
6	Description	Id of the species and strain. Each speciesID has to be unique.	Scientific name of the species or unknown .		Where the species was obtained from.	Initial density used for all different between treatments , use "treatments , use "treatment and specify in the Treatment sheet.	Functional group of the species.	
7	DATA	tt_1	Tetrahymena thermophila	WH-6 (WHI) [ATCC 16539]	ATCC	1	bacterivore	http://www.lgcstandards- atcc.org/products/all/300 07.aspx
8	MULTIPLE ROWS	unknown	unknown	unknown	unknown		unknown	
0								
9								
10								
11								
4	DOCUMENT	ATION MdBibliom	etric MdAuthors	Experiment Spe	ecies Treatmen	nt Me	easurement	Da +

DC	C 🛛 🗘 🗗 File /priva	te/var/folders/5k/g8z_7q3d6vb54m8k0cjy940r0000gp/T/R	RtmpiFRy7D/vali 🦁 🚣 🔞) 🗋 🛛 🖾 📀 🕈 🛈	1 8 (
Petchey	group me 🗤 UZH - Departmen 🗎 Gro	pup Data Policy 📄 IPBES Chapter 4 🗎 Home Server and [🗎 Keyboard Maestro 📋 Car Play Radio 🗎	Conferences 🗎 LEEF 🗎 UZ	2H
Petchey	group me w U2H - Departmen Grown of the second secon	abundance 2.2.1.3 columnName in Column names four The details are a table with one row per columnName val TRUE : If `columnName` is found in column na FALSE: If `columnName` is not found in column One or more FALSE or missing values will result in an ER dataFileName dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv dissolved_oxygen_measures.csv	Keyboard Maestro Car Play Radio TRU Idea in column names in dataFileN lue. The following values are possible for the or mos in `dataFileName` or NA in names in `dataFileName` IROR. Jar_ID DO Unit_1 Mode Location Date_time	ISOK FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE	H
		dissolved_oxygen_measures.csv	Lid_treatment	FALSE	
		dissolved_oxygen_measures.csv	Jar_ID	FALSE	
		smell.csv	NA	TRUE	
		smell.csv	smell	FALSE	
		smell cev	Date	FALSE	

FIGURE 2 An example of the validation report. The full validation report is in the supplemental material file 'Validation_Scheme.pdf'

4.3 | Using the emeScheme

The functionality in the emeScheme, actually of albftool dmdScheme derived metadata schemes, can be accessed by any of three approaches. As the scheme (and the accompanying R package) can be uploaded to the scheme repository (Krug, 2020), they are usable from a universal web app (Krug, 2019) (Figure 3). Each time the web app is started, it reloads a list of available scheme packages (and their accompanying R packages), and these can then be used in the app.

Even though this approach is the easiest, it requires the uploading of the metadata as well as the data to the server for validation. This might not be feasible because of confidentiality/privacy reasons or because of the large size of the data files. In this case, the app can also be launched from a local R session. The app then runs on the local computer and data never leaves the local computer.

As a third option, the emeScheme and all dmdScheme derived packages can also be used from the R command line.

Glossary

- Analysis—processing the analysis-ready data in order to address the research question.
- Analysis-ready data—data ready for analysis; may be "ready" for a limited set of analyses. An example would be abundance of each of the species in a set of communities (e.g., population dynamic data of ecological communities). (Contrast with raw data.)
- Data deposit package-a collection of data and metadata files

deposited in a long-term repository. This consists of at least one data file and the **rich metadata** describing the data file(s) and associated information. May often contain multiple data files, each with its own **metadata** file.

- Discovery metadata—metadata which is useful for finding/ discovering the data. This includes for example bibliometric metadata. It can also contain information about the species and location. In specialized repositories, this metadata can be more complex and contain more properties (e.g. GBIF (2020) which uses the EML metadata scheme (Jones et al., 2019)), than for example in Zenodo (2020) which is using a general metadata scheme (DataCite, 2021). Discovery metadata should be indexed and be available to a search engine. The scheme describing this metadata is usually given by the repository.
- Domain/research domain—a grouping of e.g. experiments, research, and/or questions addressed, whose data sets can be described using metadata following one metadata scheme which can be regarded as rich metadata. One example is "Experimental Microbial Ecology" for which the metadata scheme emeScheme (Krug & Petchey, 2019b) was developed. Fields, such as Ecology and Evolutionary Biology, contain numerous domains.
- Domain-specific metadata scheme-a metadata scheme for a domain.
- FAIR data principles—guiding principles to make data Findable, Accessible, Interoperable, and Reusable (Wilkinson et al., 2016).
- Field-specific metadata scheme—a metadata scheme general and broad enough to apply to an entire field. For example the Ecological Metadata Scheme (EML) (Jones et al., 2019).

WILEY

Vallable dmdSchemes dmdScheme_0.9.5 emsScheme_0.9.5	
dmdScheme_0.9.5	
emescheme_0.9.5	
1] "Active scheme is dmdScheme version 0.9.5"	
Download New Scheme	
Lempty scheme Spreadsheet	
Inload Spreadsheet containing M	letadata
opicad opicadonect containing i	
ielect Spreadsheet	
Select Spreadsheet Browse No file selected	
Browse No file selected	
Browse No file selected	
belect Spreadsheet Browse No file selected Upload Datafiles Select Datafiles	
Browse No file selected	
belect Spreadsheet Browse No file selected Browse No file selected Browse No file selected	
belect Spreadsheet Browse No file selected Upload Datafiles Browse No file selected Datafiles Browse No file selected Detect Datafiles Detect Datafile	
belect Spreadsheet Browse No file selected Upload Datafiles Browse No file selected Download Validation Report	
belect Spreadsheet Browse No file selected Upload Datafiles Browse No file selected Download Validation Report Format of report Tormat o	
biolocit Spreadsheet Browse No file selected Upload Datafiles select Datafile Browse No file selected Download Validation Report format or report html box	
Select Spreadsheet Browse No file selected Upload Datafiles Select Datafiles Browse No file selected Download Validation Report iomat of report iomat of report iomat of concert	
biolocit Spreadsheet Browse No file selected Upload Datafiles biolocit Datafiles Browse No file selected Download Validation Report Intral Idad Download Down	
Interest of report Interest of the selected Interest of the selected Interest of the selected Interest of report Interest of r	

FIGURE 3 Web app to use the functionality of 'dmdScheme' derived metadata schemes. This app can be run as a https://rmkrug. shinyapps.io/dmd_app/ or also locally

- Long-term storage/preservation—the process of having data stored/preserved and accessible for the long-term (i.e., greater than 20 years envisaged).
- Long-term (storage) repositories—repositories which offer longterm storage. Examples are Zenodo (2020) or DRYAD (2021). The Zenodo repository currently has plans defined for at least 20 years of operation.
- Metadata—data about data. Metadata can be as little as the name of a variable/column in a spreadsheet of data, though such limited metadata would likely not be considered rich metadata and may not make the data FAIR. Metadata can be assigned two nonexclusive aspects, namely discovery metadata and use metadata.
- Metadata scheme—a formalized description of the metadata to be included in, for example, a data deposit package, their formats, and which ones are compulsory or not. A formal scheme assists with the indexing of the metadata that is required for programmatic searching and extracting metadata and data from repositories.
- Preprocessing—the preparation of the raw data to make it analysis-ready. This should be done by a script to make the process reproducible and may use different parameters/methods

which need to be adjusted based on the research question and the **raw data**.

- Raw data—data as provided by the measuring device. This could be images or videos taken from a camera, tables as returned from machines or hand-written records.
- Rich metadata—defined by the Research Data Alliance (Research Data Alliance, 2017) as "data with enough accurate and relevant attributes to make it easily findable."
- Use metadata—metadata which is useful/essential to be able to (re)use the data. In its most basic form, this is information containing the column names and description of the data files. It should also contain information about the experimental layout, approach, and data. This metadata can be described either by the metadata scheme used by the repository (GBIF (2020) uses the EML metadata scheme (Jones et al., 2019) which includes use metadata) or as an additional metadata file as defined by, for example, a domain-specific metadata scheme. These data do not have to be indexed.

ACKNOWLEDGMENTS

We have to thank all members of the Predictive Ecology Group at the University of Zurich who provided input in the development of the emeScheme and functioned as guinea pigs in developing and testing this approach. Funding was provided by the SNF Project 310030_188431, and University Research Priority Programme Global Change and Biodiversity. Finally, we have to thank the three anonymous reviewers whose input provided encouragement and constructive critique to improve the manuscript.

CONFLICT OF INTEREST

The authors declare that they have no conflict of interest.

AUTHOR CONTRIBUTIONS

Rainer M. Krug: Conceptualization (lead); methodology (equal); software (lead); writing-original draft (lead). Owen L. Petchey: Conceptualization (supporting); methodology (equal); writing-original draft (supporting).

OPEN RESEARCH BADGES

0

This article has earned an Open Materials Badge for making publicly available the digitally-shareable data necessary to reproduce the reported results. The data is available at https://doi.org/10.5281/zenodo.3894237 and https://doi.org/10.5281/zenodo.4529180s.

DATA AVAILABILITY STATEMENT

The package does not use any data. The code is available as followed: dmdScheme Package: The package is available on github at https://github.com/Exp-Micro-Ecol-Hub/dmdScheme. The version used in this paper (v1.2) has the doi https://doi.org/10.5281/ zenodo.3894237. emeScheme Package: The package is available on github at https://github.com/Exp-Micro-Ecol-Hub/emeScheme. The version used in this paper (v1.1.7) has the doi https://doi. org/10.5281/zenodo.4529180.

ORCID

Rainer M. Krug https://orcid.org/0000-0002-7490-0066 Owen L. Petchey https://orcid.org/0000-0002-7724-1633

REFERENCES

- Altermatt, F., Fronhofer, E. A., Garnier, A., Giometto, A., Hammes, F., Klecka, J., Legrand, D., Mächler, E., Massie, T. M., Pennekamp, F., Plebani, M., Pontarp, M., Schtickzelle, N., Thuillier, V., & Petchey, O. L. (2015). Big answers from small worlds: A user's guide for protist microcosms as a model system in ecology and evolution. *Methods in Ecology and Evolution*, 6(2), 218–231. https://doi. org/10.1111/2041-210X.12312
- Atenas, J., & Havemann, L. (2015). Open data as open educational resources: Case studies of emerging practice. https://doi.org/10.6084/ m9.figshare.1590031.v1
- Bishop, L., & Kuula-Luumi, A. (2017). Revisiting qualitative data reuse: A decade on. SAGE Open, 7(1), 2158244016685136. https://doi. org/10.1177/2158244016685136
- Boettiger, C., & Jones, M. B. (2019). EML: Read and write ecological metadata language files.
- Campbell, H. A., Micheli-Campbell, M. A., & Udyawer, V. (2018). Early career researchers embrace data sharing. *Trends in Ecology & Evolution*, 34(2), 95–98. https://doi.org/10.1016/j.tree.2018.11.010
- Culina, A., Crowther, T. W., Ramakers, J. J. C., Gienapp, P., & Visser, M. E. (2018). How to do meta-analysis of open datasets. *Nature Ecology & Evolution*, 2(7), 1053–1056. https://doi.org/10.1038/s4155 9-018-0579-2
- Darwin Core task group, B. I. S. (TDWG) (2014). Darwin Core: 2014-11-08. Zenodo. https://doi.org/10.5281/ZENODO.12694
- DataCite Metadata Scheme (2021). https://schema.datacite.org
- DRYAD (2021). https://datadryad.org/stash
- Dublin Core: Metadata Terms (2020). https://www.dublincore.org/speci fications/dublin-core/dcmi-terms/
- Dufour, I. F., & Richard, M.-C. (2019). Theorizing from secondary qualitative data: A comparison of two data analysis methods. *Cogent Education*, 6(1), 1690265. https://doi.org/10.1080/23311 86X.2019.1690265
- Garnier, A., Hulot, F. D., & Petchey, O. L. (2020). Manipulating the strength of organism-environment feedback increases nonlinearity and apparent hysteresis of ecosystem response to environmental change. *Ecology and Evolution*, 10(12), 5527–5543. https://doi. org/10.1002/ece3.6294
- GBIF (2020). https://www.gbif.org/
- Gregory, K., Groth, P., Cousijn, H., Scharnhorst, A., & Wyatt, S. (2019). Searching data: A review of observational data retrieval practices in selected disciplines. *Journal of the Association for Information Science* and Technology, 70(5), 419–432. https://doi.org/10.1002/asi.24165
- Gregory, K., Groth, P., Scharnhorst, A., & Wyatt, S. (2020). Lost or found? Discovering data needed for research. *Harvard Data Science Review*, 2(2). https://doi.org/10.1162/99608f92.e38165eb
- Heaton, J. (2008). Secondary analysis of qualitative data: An overview. Historical Social Research/Historische Sozialforschung, 33(3(125)), 33-45.
- Henty, M. (2015). Teaching with research data (report to the Australian National Data Service (ANDS)) (p. 37).
- Jones, M., O'Brien, M., Mecum, B., Boettiger, C., Schildhauer, M., Maier, M., Chong, S. (2019). Ecological metadata language version 2.2.0. https://doi.org/10.5063/f11834t2
- Krug, R. M. (2019). dmdScheme App. https://rmkrug.shinyapps.io/ dmd_app/

- Krug, R. M. (2020). dmdSchemeRepository. https://github.com/Exp-Micro-Ecol-Hub/dmdSchemeRepository
- Krug, R. M., & Petchey, O. L. (2019a). dmdScheme: An r package for working with domain specific MetaData schemes (Version v0.9.22). https://doi.org/10.5281/zenodo.3581970
- Krug, R. M., & Petchey, O. L. (2019b). emeScheme: A package for working with ecological microbial experimental MetaData. Zenodo. https:// doi.org/10.5281/zenodo.1544945
- Pasquetto, I., Randles, B., & Borgman, C. (2017). On the reuse of scientific data. Data Science Journal, 16, 8. https://doi.org/10.5334/ dsj-2017-008
- Pennekamp, F., Griffiths, J. I., Fronhofer, E. A., Garnier, A., Seymour, M., Altermatt, F., & Petchey, O. L. (2017). Dynamic species classification of microorganisms across time, abiotic and biotic environments - A sliding window approach. *PLoS One*, *12*(5), e0176682. https://doi. org/10.1371/journal.pone.0176682
- Poisot, T., Bruneau, A., Gonzalez, A., Gravel, D., & Peres-Neto, P. (2019). Ecological data should not be so hard to find and reuse. *Trends in Ecology & Evolution*, 34(6), 494–496. https://doi.org/10.1016/j. tree.2019.04.005
- Research Data Alliance (2017). Rich Metadata DFT. https://smw-rda. esc.rzg.mpg.de/index.php/Rich_Metadata
- Roche, D. G., Kruuk, L. E. B., Lanfear, R., & Binning, S. A. (2015). Public data archiving in ecology and evolution: How well are we doing? *PLOS Biology*, 13(11), e1002295. https://doi.org/10.1371/journ al.pbio.1002295
- Schneider, F. D., Fichtmueller, D., Gossner, M. M., Güntsch, A., Jochum, M., König-Ries, B., Le Provost, G., Manning, P., Ostrowski, A., Penone, C., & Simons, N. K. (2019). Towards an ecological trait-data standard. *Methods in Ecology and Evolution*, 10(12), 2006–2019. https://doi. org/10.1111/2041-210X.13288
- Wilkinson, M. D., Dumontier, M., Aalbersberg, I. J. J., Appleton, G., Axton, M., Baak, A., Blomberg, N., Boiten, J.-W., da Silva Santos, L. B., Bourne, P. E., Bouwman, J., Brookes, A. J., Clark, T., Crosas, M., Dillo, I., Dumon, O., Edmunds, S., Evelo, C. T., Finkers, R., ... Mons, B. (2016). The FAIR Guiding Principles for scientific data management and stewardship. *Scientific Data*, *3*, 160018. https://doi.org/10.1038/ sdata.2016.18
- Worsfold, N. T., Warren, P. H., & Petchey, O. L. (2009). Contextdependent effects of predator removal from experimental microcosm communities. *Oikos*, 118(9), 1319–1326. https://doi. org/10.1111/j.1600-0706.2009.17500.x
- Zenodo Research. Shared (2020). https://zenodo.org/
- Zimmerman, A. (2007). Not by metadata alone: The use of diverse forms of knowledge to locate data for reuse. *International Journal on Digital Libraries*, 7(1–2), 5–16. https://doi.org/10.1007/s00799-007-0015-8
- Zimmerman, A. S. (2008). New knowledge from old data: The role of standards in the sharing and reuse of ecological data. *Science, Technology,* & *Human Values, 33*(5), 631–652. https://doi.org/10.1177/01622 43907306704

SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section.

How to cite this article: Krug RM, Petchey OL. Metadata Made Easy: Develop and Use Domain-Specific Metadata Schemes by following the dmdScheme approach. *Ecol Evol.* 2021;11:9174–9181. https://doi.org/10.1002/ece3.7764