A Hydrologist's Guide to Open Science

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Abstract. Open, accessible, reusable, and reproducible hydrologic research can have a significant impact on the scientific community and broader society. While more individuals and organizations within the hydrology community are embracing open science practices, technical (e.g., limited coding experience), resource (e.g., open access fees), and social (e.g., fear of being scooped) challenges remain. Furthermore, there are a growing number of constantly evolving open science tools,

- 20 resources, and initiatives that can seem overwhelming. These challenges and the ever-evolving nature of the open science landscape may seem insurmountable for hydrologists interested in pursuing open science. Therefore, we propose general Open Hydrology Principles to guide individual and community progress toward open science for research and education and the Open Hydrology Practical Guide to improve the accessibility of currently available tools and approaches. We aim to inform and empower hydrologists as they transition to open, accessible, reusable, and reproducible research. We discuss the
- 25 benefits as well as common open science challenges and how hydrologists can overcome them. The Open Hydrology Principles and Open Hydrology Practical Guide reflect our knowledge of the current state of open hydrology; we recognize that recommendations and suggestions will evolve and expand with emerging open science infrastructures, workflows, and research experiences. Therefore, we encourage hydrologists all over the globe to join in and help advance open science by contributing to the living version of this document and by sharing open hydrology resources in the community-supported
- 30 repository (https://open-hydrology.github.io).

1 Motivation for Open Hydrology

Hydrologic research intersects various Earth sciences (e.g., climatology, geology, ecology) and social science (e.g., policy and public health) to tackle pressing environmental and societal challenges. Further, hydrologic research often incorporates qualitative and quantitative data from numerical models, laboratory techniques, field observations, and stakeholder surveys,

- 35 all of which rely on separate sets of assumptions, standards, and methods. When combined, the interdisciplinary nature and wide range of methods used in hydrology can result in research that is neither accessible nor usable by the scientific community and relevant stakeholders. A recent study found that only 1% of hydrology papers were fully reproducible (Stagge et al., 2019). Therefore, hydrologists must evolve to ensure their data and research process is transparent and reproducible. Doing so will strengthen their contribution to hydrologic research practices, educational resources, knowledge
- 40 base, and applications, as well as educational resources, science, communication, societal engagement, and public trust (Cudennec et al., 2020).

Open science offers an established framework for hydrologists to purposefully document and widely share scientific research that is accessible to scientists and the public, as to improve their work's transparency and reproducibility. Open science is a movement that is transforming the nature of research design and conduct, as well as how experts and non-experts alike build

- 45 upon and learn from each other's scientific work. Researchers and stakeholders are recognizing open science as the future of hydrologic research, scientific communication, and education (e.g., (Baker et al., 2020; ECMWF moves towards a policy of open data, 2021; UNESCO, 2021; WMO Data Conference - Outcome Material, 2021). Community-driven efforts within the field of hydrology have cemented the demand and necessity for open science, specifically referred to as open hydrology (Blumenthal et al., 2014; de Vos et al., 2020; Ferrari et al., 2018; Mwelwa et al., 2020; Powers and Hampton, 2019; Tai and
- 50 Robinson, 2018; Zuiderwijk and Hinnant, 2019), research projects (e.g.(Beck et al., 2020; Lowndes et al., 2017), and conferences (e.g., (OpenAIRE's Mission and Vision, 2021). Likewise, many organizations have begun to provide support, conference sessions, online repositories, and educational training opportunities to overcome challenges and support researchers as they transition to open hydrology (Baker et al., 2020). Furthermore, several hydrology journals now require data and analyses to be made publicly available upon article publication (Rosenberg and Watkins, 2018; American
- 55 Geophysical Union (AGU), 2019). Table 1 provides a summary of the various hydrology-focused efforts towards open science (e.g., academic articles, GitHub pages, web platforms, etc.). Despite general calls and efforts to support open science, practical guidance on steps hydrologists can take to incorporate

open principles in their research is limited. The objective of this paper is to introduce the *Open Hydrology Principles* and *Open Hydrology Practical Guide* to help hydrologists take actionable steps towards open science. We focus on four major

- 60 research stages: (1) research process and approach, (2) data collection and analysis, (3) software development and use, and (4) publishing. For each stage, we discuss guiding principles for meaningful engagement in open hydrology and we provide practical steps to answer how to engage in openness. Finally, we address potential challenges by walking through "What if...?" questions that hydrologists might encounter when pursuing open science (Appendix A). Herein, we draw on existing open science research, efforts, and experiences in hydrology as well as in disciplines outside of hydrology that have made
- 65 significant progress toward open science. The Open Hydrology Principles and Open Hydrology Practical Guide introduced here are available online at <u>open-hydrology.github.io</u>. This website provides a platform to facilitate continued discussion and evolution of open hydrology presented in this article (i.e., serve as a living document), highlight emerging open hydrology resources and educational opportunities, and serve as a meeting point to connect open hydrologists. We invite everyone to

contribute to the discussion, share resources and experiences, and work towards incorporating open science principles in all

70 stages of their hydrology research.

2 Open Hydrology Principles & Open Hydrology Practical Guide

Open hydrologists, including those who are beginning their journey to those who are more experienced, can use the Open Hydrology Principles and Open Hydrology Practical Guide to expand their open hydrology practice. Adoption of these open hydrology principles is not restricted to a specific stage of research. Furthermore, these principles can and should be
implemented throughout a research project's timeline. Transitioning to fully open hydrology research will likely remain a work in progress and cannot happen overnight. Hydrologists will need to work within current logistical, legal, financial, cultural, and other constraints. In this section, we outline four guiding principles corresponding to four major hydrologists apply these principles. We have also included a discussion on anticipating and overcoming challenges to practicing open hydrology (Appendix A), which can be used for educational purposes, as well as spur discussion and action in open hydrologists of all levels and in various settings from classrooms to lab groups to workshops.

Principle 1 - Open Research Process and Approach: Open hydrologists intentionally plan for, describe, and share the entire research process and approach from motivation to the final product.

Research process and approach includes openly discussing stakeholder engagement practices and agreements, failed methods, negative results, use of public datasets, and feedback from third parties. Openly sharing a well-documented research process and approach in hydrology will improve the efficacy of internal research and knowledge exchange and give critical insight to aspiring researchers that may not be fully captured in journal articles. Furthermore, sharing the entire research process and approach is critical for the hydrology field because research applications directly impact society (e.g., water management, climate model simulations). Thus, open hydrologists must ensure their research is accessible to the science community and the general public while adhering to ethical standards and respecting the goals and wishes of their collaborators. We encourage the use of non-proprietary methods, tools, and resources whenever possible.

Practical Guide to Open Research Process and Approach

In hydrology, published studies that allow the reader to follow every step of the work, from motivation to publication, remain scarce. Although results are the main focus of a paper, sharing the entire research process and approach (e.g., failed

95 attempts and lessons learned that impacted research outcomes) alongside the paper can improve the impact and openness of research (Lowndes et al., 2017; Colavizza et al., 2020). We suggest including a reasonable explanation of why certain data and methods were chosen and how they were used in the main text of journal articles or an appendix using accessible language. Open hydrologists can maximize openness by minimizing the use of jargon in all materials such that experts and non-experts alike are able to understand and reproduce the research and underlying assumptions. For example, words

100 common in hydrology like 'dam' and 'flood' can have different meanings between experts and non-experts (Venhuizen et al., 2019). Open hydrologists can consider getting feedback on the accessibility of research process and approach description by sharing drafts with collaborators and stakeholders.

Perceptual models are in-depth descriptions or visualizations that represent process understanding; qualitative and quantitative data incorporation; field-, lab-, or computer-based methods and protocols; and project stages , also known as a

- 105 workflow model (Enemark et al., 2019; Wagener et al., 2020). Perceptual models help researchers decide and describe which methods are most appropriate to address the study objective based on underlying assumptions. Consequently, perceptual models will vary by researcher, information, and resource availability. By including accessible perceptual models, researchers can communicate differences in the interpretation and understanding of hydrologic systems while identifying dominant hydrologic processes across scales and experiment types. Moreover, such models allow to explicitly handle
- 110 uncertainties and failures during the research process and provide a coherent picture of the entire research process to experts and non-experts (Wagener et al., 2020).

Given the important societal and policy implications of hydrologic research, it is important for open hydrologists to codevelop data management plans, research focus, and research dissemination plans alongside stakeholders as early as possible in the research process. Stakeholders may include fellow researchers, industry professionals, non-profit organizations,

- 115 government officials, communities, members of the public, and other parties that have an interest in hydrologic research. Engagement and co-development with stakeholders are still limited in the field of hydrology. For example, a global survey found that 87% of climate research that engaged Indigenous communities was extractive; communities had minimal participation or decision-making authority in the researcher-stakeholder relationship (David-Chavez and Gavin, 2018). Consequently, we suggest incorporating FAIR (Wilkinson et al., 2016; Garcia et al., 2020) and CARE (Carroll et al., 2020;
- 120 Walter et al., 2020) data standards into open hydrology research. FAIR data standards were developed to improve machine readability of data and ultimately increase research reproducibility. CARE data standards were developed by Indigenous scholars to advance data governance and data sovereignty. Setting up guidelines on how open hydrologists will ethically and respectfully engage with relevant stakeholders in their research approach and process is especially important when co-developing and conducting community science or citizen science (Robinson et al., 2018; Walker et al., 2021).

125 Principle 2 – Open Data: Open hydrologists document all components of their data collection and analysis pipeline, favoring open and non-proprietary technologies.

Hydrologists often combine data from a wide variety of field, laboratory, and computer sources, such as streamflow gauges, water samples, remote sensing datasets, digital elevation models, land use maps, and meteorological data. Data quality can only be assessed, and potential results replicated when the hardware design and specifications of measurement tools and data

130 loggers are available to the public. We encourage use of open (i.e. non-proprietary) data formats, hardware specifications and software in data collection and processing workflows, and their systematic documentation with the aim to enable their re-use by the interested reader. Data from the laboratory is often exported in formats specific to the laboratory device and typically requires some data reformatting necessary for post-processing. The format of computer-generated data (e.g., hydrology model outputs) varies

- 135 with the computer software that generated it. An open data collection and analysis pipeline includes information on (1) hardware and software used, (2) original and processed (meta-)data and databases, (3) data processing and analysis techniques and tools used, and (4) documentation of the overall analysis process, including assumptions and perceptual models (see Principle 1). Re-usability and transferability of software and data processing pipelines greatly accelerates scientific progress in hydrology by reducing time wasted on re-inventing the wheel, helping discover problems in the
- 140 analysis, and improving the quality of hydrologic research.

Practical Guide to Open Data Collection and Analysis

Open hydrologists share and cite the source and collection method of all qualitative and quantitative data involved in their research, including field, laboratory, computer, and/or third-party (online) data used. A current list of data repositories commonly used by hydrologists that adhere to open science standards is kept on open-hydrology.github.io. The best place to store data for an open hydrology project depends on the type and size of the data, the specific scientific domain, and other

- 145 store data for an open hydrology project depends on the type and size of the data, the specific scientific domain, and other requirements stipulated by the funders and stakeholders. If an open hydrology study relies on third-party data that is not (yet) open, ask the original data creators to make the data or a data subset publicly available. Archived original, intermediate, and final versions of all data used to obtain the results of a particular study are crucial for reproducing open hydrology research. See Principle 4 for more details on publishing data.
- 150 To make data and analysis sharing more straightforward, a data management plan should be developed in the early stages of the research project, emphasizing open data principles and maintaining cyberinfrastructure and community standards. Data management plans describe where data will come from, what formats it will be stored in, who will manage and maintain it, how privacy will be maintained (if applicable), and how data and results will be shared and stored in the short- and longterm. Data management plans may be required by funders where they are typically limited in length. However, extended data
- 155 management plans can increase research project transparency, and can be created using publicly available templates (e.g., ckan, DMPTool, resources.data.gov) that adhere to funder requirements and formatting. Some tools (e.g., ckan) can help hydrologists make previously unpublished data publicly available, even after publication.

Open hydrologists should explicitly provide public access (e.g., through a link accessible on the journal publication site) to: (1) raw data and associated metadata (including specifications of the devices used to collect data), (2) descriptions and citations for the analysis methods and software versions used, (3) workflows, code, and software developed to collect and analyze data, (4) descriptions of quality controls used when processing raw data, (5) final processed data, and (6) descriptive methods used to integrate data into other processing tools. The level of detail necessary to ensure openness can differ wildly between studies. When data sources, processing, and accessibility are complex, additional descriptions in an appendix or supplementary information may be appropriate upon publication of hydrologic research.

- 165 Ideally, all data used to draw conclusions should be published publicly to facilitate reproducibility, but copyright on thirdparty data, privacy, or other issues related to data sensitivity may prohibit open publication of all underlying data. Discuss, agree, and document with your collaborators what can be shared publicly as early as possible. If certain datasets cannot be shared publicly, add a statement to the final publication explaining what conditions need to be fulfilled to obtain access to the data and why some data remain private. Relevant resources and local guidelines for data anonymization and sharing (e.g.,
- 170 General Data Protection Regulation) need to be considered before developing a data management plan and conducting research (Zipper et al., 2019). When making data publicly available, open hydrologists strive to store data in universal, nonproprietary, and software agnostic formats that are compatible with most operating systems and include metadata (data about the data that provides background context). For example, text and tabulated data can be stored as standard American Standard Code for Information Exchange (ASCII) text (American Standard Code for Information Interchange) instead of
- 175 proprietary or software-specific types (e.g., Microsoft Word .docx or Excel .xlxs files) that require a paid software license to use. Even if it might be computationally efficient, avoid creating new file types that are specific to a certain model or software. For most hydrologic data, NetCDF (i.e., .nc) files are currently the gold standard for storing data and metadata. If metadata cannot be part of the data (file) itself, store the metadata in as close proximity to the data as possible. For example, open hydrologists can include links in the metadata to where the data is stored and vice versa. They can also use standard
- 180 naming and unit conventions (e.g., SI units), metadata formats (e.g., Water Metadata Language), and be informative and sufficiently complete to allow for better understanding of the data and reproduction of study results.

Principle 3 – Open Software Development and Use: Open hydrologists test, archive, document, and version control their research code and software using standard open-source software protocols and accessible documentation language.

- 185 Hydrologic research often relies on the use of computational models and research software, which must be archived with appropriate documentation and publicly accessible for verifiability and reproducibility of results. Research software is any code or program used to compile, filter, and process data, create model simulations, and generate data tables or plots. This includes compiled programs, stand-alone and embedded scripts (e.g., in spreadsheets), and computational notebooks (e.g., Jupyter notebooks, RMarkdown documents). Open hydrologists document and describe code, software versions, and 190 descriptions of each variable name, meaning, and unit when developing software. Whenever possible, open hydrology
- software builds on existing open-source software and programming languages (e.g., Python and R) to avoid excessive licensing and setup costs for anyone trying to use these models.

To prevent duplication of failed attempts and increase accessibility and reproducibility, it is crucial to document the complete version history of software development in a clear and comprehensible way using standardized version tracking

195 and version control tools (e.g., Git and SVN). This is particularly important in hydrology, which relies heavily on testing continuous adaptations of existing models as new data becomes available. Transparent version control, software documentation, software guides, and software unit tests are all prerequisites to producing reliable hydrologic model outputs,

including predictions of future water resource availability and hydrologic risk, among others. For software licensing and publishing, see Principle 4.

200 Practical Guide to Open Code and Software Use and Development

Open platforms offer an effective way for open hydrologists to develop and use research software by building upon software created by others and getting community support. Open hydrologists can use open-source coding languages (e.g., R and Python) and open-source software (e.g., QGIS) to wrangle, analyze, and share their research findings. Repositories such as GitHub, GitLab, Bitbucket, and language-specific repositories such as CRAN and PyPI are treasure troves of software, often solving a large part of your problem. Using these public and open repositories saves you time and allows others to make use

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of your software more easily, help you improve it, and in turn build on it for your research. In addition to open-source coding languages and software, hydrologists can incorporate open-source version control system (e.g., Git) into their workflows to capture and manage changes made to code and research. Additionally, file duplication and mistakenly overwriting previous work can be prevented, while allowing others to trace the progression of code, track issues,

- 210 and collaborate (Perez-Riverol et al., 2016; Lowndes et al., 2017; Bryan, 2018). While, the command-line application form of version control systems can pose a steep learning curve, graphical user interfaces exist and public repositories (e.g., Git Desktop, Git Cola, and GitKraken) offer easy-to-use interfaces, helpful documentation, and tutorials. Various courses are available through the Carpentries (e.g., version control with Git) to help you get started using Git and online Git collaboration platforms like GitHub and GitLab (The Carpentries, 2021). These public repositories facilitate collaborative
- 215 software development, issue tracking, detailed documentation of modeling decisions, and project management. The simplest way of creating code documentation is often to include it with the software in some form, but technical documentation can also be hosted on Readthedocs. Variables need to be clearly defined and documentation must include the units directly in the code or in an associated appendix. Various open-source programming languages offer ways to generate technical documentation from the code itself (e.g., pydoc for Python and roxygen for R).
- Even if the source code of all packages used in a research project is publicly available, it may be difficult to reproduce an analysis if the versions of the packages are not known, or if the operating system version is not compatible. For this reason, several methods for sharing a computational environment have been created in recent years. Software containers (e.g., Docker) can help to share a complete computational environment, including the operating system and necessary packages with your code (Nüst et al., 2020). Open-source programming languages can also offer specific tools to keep track of
- 225 versions (e.g., renv and Docker for R). Other open-source software platforms of interest to open hydrologists may include, binder, which reproduces a computational Jupyter notebook with a single click from a software repository. Additionally, Renkulab allows version control of data, software, and computational environments from within a single platform. Renkulab also enables transparent tracking of the lineage of research results, from external data sources to final figures in articles.

When using a GitHub repository, automatic code and software testing can be implemented using continuous integration software (e.g., Travis CI), which runs pre-designed tests and workflows and checks for errors. Tests and workflows may include comparing model results to a reference dataset and alerting the user to changes in the model results or checking whether recent changes made to one section of code will cause errors in downstream code.

Principle 4 – Open Publishing: Open hydrologists publish all components of their research on citable platforms and in journals that follow ethical standards and are accessible to both the research community and general public.

- Research sharing is pivotal to enabling the transferability of hydrologic insights and building on existing hydrology research. Thus, we highly suggest open hydrologists publish all research components using a permissive license that allows editing and sharing derivative works with both scientists and the general public. There are, however, special cases where information (e.g., from water utility providers or governmental agencies) cannot be shared publicly due to privacy and safety (i.e., national security) reasons. If this is the case, the potential reproducibility limitations associated with these data need to
- 240 be considered and openly discussed.

How and where open hydrologists choose to publish their work is crucial for supporting high global standards for the accessibility, preservation, and reproducibility of hydrology research. Whenever possible, open hydrologists publish all their results (including articles, data, software, etc.) in publicly accessible repositories and journals with transparent connections between each (i.e., adding a link to the publication that points readers to the associated data and analysis code). It is also

245 important that publishers and libraries have the appropriate infrastructure in place for bibliographic tracking, transparent cross-referencing between hosted research objects, and appropriate crediting of researchers for their contributions.

Practical Guide to Open Science Publishing

There are three primary open access (OA) journal publication models: (1) gold OA or diamond OA, which provides free final typeset article access to everyone, (2) hybrid OA, which involves subscription-based journals that charge an additional fee for making a particular article freely accessible, and (3) green OA, in which the authors can self-archive the accepted, non-typeset authors' version of an article (i.e., a postprint) in a suitable repository after the journal's embargo period. Gold OA journals charge no subscription fees, but typically require an article processing charge (APC) fee. Diamond OA journals do not charge an APC and are usually funded by non-profit organizations, governments, societies, or other revenue streams. The copyright for articles published in gold or diamond OA journals stays with the authors, whereas hybrid OA may provide

- 255 the option that authors pay for obtaining the copyright on an individual article (in its final, typeset version) and for making it OA on the publisher's website. There are some exceptions to this for lead and/or corresponding authors working for government agencies where the general public is directly supporting their research; however, authors must check with the specific copyright policy of the journal for more details. Hybrid publishing has been criticized because the scientific community typically pays twice—once for the journal subscription and once for individual article OA fees (Double Dipping
- in Hybrid Open Access Chimera or Reality? JuSER, 2020; Pinfield et al., 2016).
 There are numerous aspects to consider when choosing a journal beyond OA options. These include considering the article license type, the archiving services available, the financial policies for review and publication, and the release requirements

for data, code, and software. Responsibility for moving towards open hydrology lies with the author, editors, and reviewers. Reviewers can promote proper citing and acknowledgment of data and code sources by requesting that these be made

- publicly available when they are missing from the submitted paper. To this end, reviewers can start by checking if the authors of the article adhere to the journal's open science standards. If this is not the case, the reviewer can indicate clearly in their review that the work does not comply and provide constructive feedback for how these standards can be met. If the journal does not have clearly defined open science standards, reviewers can request and provide steps on how authors can adhere to open science practices to ensure that the submitted work is reproducible. Likewise, reviewers can initiate discussions with the editor and highlight how the importance of clear open science standards provides guidance to authors
- and generally improves the quality, transparency, and reproducibility of submitted articles. Articles that have not yet undergone peer-review but are published publicly (i.e., preprints) can be shared at any stage of the open hydrology project (Saia, 2019). Preprints are a good opportunity for authors to share and get feedback from a more
- 275 posting a preprint, we suggest researchers check with their target journal about the acceptability of published pre-prints. Many journals will allow you to submit an article that has been posted as a preprint, but some will not. Visit Sherpa Romeo or the Journal Checker Tool (provided by cOAlition S) to find out about preprint policies, copyrights, and open access archiving policies from various publishers and journals.

Another important aspect related to OA publishing is the license attached to an article. Creative Commons licenses (e.g., CC-

diverse set of reviewers while retaining control of the research publication timeline (Schloss, 2017; Saia, 2019). Before

- BY) are widespread, but some publishers choose more restrictive versions, indicated by additions such as NC ("for non-commercial use") or ND ("No derivatives or adaptations of the work are permitted"). ND licenses hamper re-use of the published work since extracting figures or tables from the paper is not allowed. Besides the article itself, it is important to ensure that data and code have a permissive license (e.g., CC-BY) for legal reuse. For software, we suggest the authors start by declaring a permissive license because it improves transparency and reduces downstream licensing conflicts. However,
- 285 software developers should be aware of upstream licenses and whether those may impact their ability to choose an opensource license. See Choose a License for help on selecting suitable licenses. Text, images, videos, photos, or other media created during or associated with a hydrologic project can be licensed using a CC-BY license to ensure creator attribution (i.e., the BY of CC-BY).
- Data and code associated with an article must be cited in the article and published in a long-term repository, with a separate Digital Object Identifier (DOI) and a permissive open-source license (e.g., re3data). This facilitates citations and allows for re-use and modification of work. To ensure that researchers providing software and data get properly credited for their efforts, third-party data or software used by others must be cited accordingly. Unlike data, source code for research software rarely requires much storage and can be shared quite easily (see Principle 3). The problematic aspect of software development is ensuring that it is available and usable for decades. Journals often allow software to be published as a supplement, which is most suitable for scripts and Jupyter notebooks created specifically for a publication. More general-use software should be published and archived in a public repository with a separate DOI. One prime example is Zenodo—a free

service for hosting data and software that offers long-term (~20 year) storage, integration with GitHub, and provides a DOI for each software version deposited there. These DOIs can be used as references in publications and clearly defines the software version used.

300 3. Summary and Outlook

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Open, accessible, reusable, and reproducible hydrologic research will have the largest equitable impact on the scientific community and broader society. Funding agencies, publishers, and hydrologic organizations are increasingly requiring hydrologists to adopt open science practices. We wrote 'A Hydrologist's Guide to Open Science' to facilitate the transition to fully open science within hydrology, for hydrologists at the forefront of this movement, and those transitioning their research to fully open science. This work introduces four guiding Open Hydrology Principles referring to each of the four main research stages: (1) research process and approach, (2) data collection and analyses, (3) software development and use,

and (4) publishing. For each principle, we provided actionable steps (i.e., the Open Hydrology Practical Guide) on how to become a more open hydrologist.

Hydrologists intending to implement the advice given here will, undoubtedly, run into challenges along their path. We

310 identified and addressed twelve challenges in five scenarios that cover various hydrology career stages (Appendix A). Researchers interested in open hydrology can use these scenarios to roleplay common challenges and brainstorm strategies with colleagues (e.g., in your lab's or department's journal club) to overcome these challenges on their way to becoming an as-open-as-possible hydrologist.

While approaches and methods related to open science are in constant development, the Open Hydrology Principles will

315 guide us in the future. The Open Hydrology Practical Guide is written based on currently available paradigms, tools, policies, and experiences; it will be updated and replaced by guidance as the state of hydrology and open science policies change. Therefore, we created open-hydrology.github.io—a living version of this article to build a supportive and collaborative open science community within the field of hydrology.

Getting to the point where a majority (or more) of hydrologists participate in open hydrology will take time and effort. These

320 efforts will be driven by individual hydrologists implementing openness as well as by organizational and governmental policies that incentivize open science. This step-by-step process must be regarded as a valuable contribution to hydrology and systemically supported by scientific institutions and beyond. Only then can the entire hydrology community really come together, build on one another's work, strengthen hydrologic knowledge, and maximize the benefits of hydrologic research to the whole of society.

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330 code nor data associated with this article. The authors have no conflicts of interest to declare. Please endorse the Open Hydrology Principles, contribute to the open hydrology discussion, and access a living version (i.e., up-to-date version) of the Open Hydrology Principles and Practical Guide online at https://open-hydrology.github.io.

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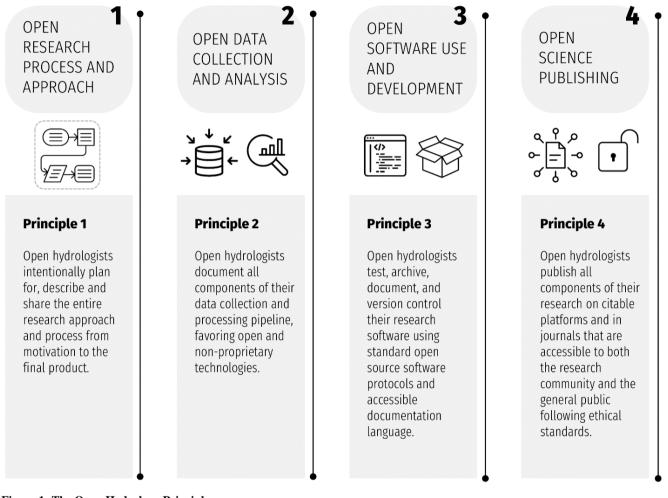


Figure 1: The Open Hydrology Principles.

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Table 1: A selection of efforts that discuss and support openness in hydrology and related sub-disciplines (*peer-reviewed article,
**community contribution). For an up-to-date resource list, see <u>https://open-hydrology.github.io/resources/.</u>

Theme	Title	Reference
	The Tao of open science for ecology*	(Hampton et al., 2015)
General	Enhancing Climate Change Research With Open Science*	(Tai and Robinson, 2018)
	Open weather and climate science in the digital era*	(de Vos et al., 2020)

	Cracking "Open" Technology in Ecohydrology*	(Turner et al., 2020)	
	The importance of open science for biological assessment of aquatic environments*	(Beck et al., 2020)	
	Open Hydrology Website (established with this manuscript)	https://open-hydrology.github.io/	
	HydroShare is CUAHSI's online collaboration environment for sharing data, models, and code.	(HydroShare, 2021)	
	Joint Editorial—On the future of journal publications in hydrology*	(Blöschl et al., 2014)	
Open	Improving the visibility of hydrological sciences from developing countries*	(Hughes et al., 2014)	
Publishing	Assessing data availability and research reproducibility in hydrology and water resources*	(Stagge et al., 2019)	
	Invigorating Hydrological Research Through Journal Publications*	(Quinn et al., 2020)	
	Most computational hydrology is not reproducible, so is it really science?*	(Hutton et al., 2016)	
	Comment on "Most computational hydrology is not reproducible, so is it really science?"	(Melsen et al., 2017)	
	Towards a more reproducible ecology*	(Borregaard and Hart, 2016)	
	Elevating The Status of Code in Ecology*	(Mislan et al., 2016)	
	Using R in hydrology: a review of recent developments and future directions*	(Slater et al., 2019)	
	Hydrogeological conceptual model building and testing: A review*	(Enemark et al., 2019)	
Open Source	Open science, reproducibility, and transparency in ecology*	(Powers and Hampton, 2019)	
and Reproducibility	On doing large-scale hydrology with Lions: Realising the value of perceptual models and knowledge accumulation**	(Wagener et al., 2020)	
	Current status on the need for improved accessibility to climate models code*	(Añel et al., 2021)	
	Created for EGU GA short course "Using R in Hydrology"**	(Young Hydrologic Society (YHS), 2021)	
	"a specific list of open hydrology-relevant projects. This list is	(GitHub - Open-Environmental-	
	curated from repositories that make our lives as (eco-)hydrologists easier."**	Science/awesome-open- hydrology, 2021)	
	Hydrological Data and Modeling in R. This initiative was built on the EGU GA short course "Using R in Hydrology"**	(ropensci/Hydrology: CRAN Hydrology, 2021)	

	Challenges and Opportunities of Open Data in Ecology*	(Reichman et al., 2011)	
	Ecological data sharing*	(Michener, 2015)	
	Editorial – Towards FAIR and SQUARE hydrological data*	(Cudennec et al., 2020)	
Open Data	Large-sample hydrology: recent progress, guidelines for new datasets and grand challenges	(Addor et al., 2020)	
	Lessons learnt from checking the quality of openly accessible river flow data worldwide*	(Crochemore et al., 2020)	
		(Educational Resources for	
	Educational Resources for Hydrology & Water Resources**	Hydrology & Water Resources CUAHSI HydroShare, 2021)	
Open	A buffet of new resources for teaching hydrology and water resources!**	(Gleeson, 2020)	
Education	Online teaching in courses related to climate risk, drought, water resources and sustainability**	(Van Loon, 2020)	
	When the students are gone: Transition to online teaching**	(Sprenger, 2020)	
	Open teaching to navigate hydrology: how ready are we?**	(Schaefli, 2021)	
	Barriers to the exchange of hydrometeorological data in Europe: Results from a survey and implications for data policy*	Viglione et al., 2010	
	Balancing Open Science and Data Privacy in the Water Sciences*	(Zipper et al., 2019)	
Data Exchange	Intergovernmental cooperation for hydrometry – what, why and how?*	(Dixon et al., 2020)	
	E-monitoring the nature of water*	(Pecora and Lins, 2020)	
	The devil's in the details: data exchange in transboundary waters*	(Mukuyu et al., 2020)	
	"Hydrological data and WMO Data Policy", in November 2020, as	(WMO Data Conference -	
	part of the WMO Data Conference**	Outcome Material, 2021)	

Appendix A

505 There are no "one-size-fits-all" open hydrology best practices because each project exists within a unique context of research inputs and outputs, institutional structures, and collaborators, each motivated by different incentives and policies in place. Challenges to practicing open hydrology may arise throughout the research process and may depend on the career stage of researchers. In general, challenges to practicing open hydrology revolve around socio-cultural, organizational, economic, technological, political, and legal themes that are listed in (A1) Table 1 (About FOSTER, 2021; Allen and Mehler, 2019).

- 510 Socio-cultural challenges refer to a hydrologist's limited knowledge of, confidence in, and access to open hydrology practices and tools. Technological, organizational, and economic themes refer to challenges beyond the control of individual researchers trying to do open hydrology. For example, hydrologists may strive to do open research but be limited by unstable internet connections (i.e., technical challenge), power to advocate for publishing their work openly (i.e., organizational), or lack of funds to pay for open access publication fees (i.e., economic).
- 515 Resolving obstacles to open hydrology takes know-how and persistence since challenges can be complex. To facilitate direct practice in addressing challenges to open hydrology, we present five scenarios and outline key discussion points and recommendations. Each scenario highlights a particular career stage and addresses specific challenges listed in Table 3. These five scenarios are inspired by active learning educational materials (Learner Profiles, 2021). Researchers interested in open hydrology can use these scenarios to roleplay common challenges and brainstorm strategies with colleagues (e.g., in
- 520 your lab's or department's journal club) to overcome these challenges. For each scenario, we encourage open hydrologists to ask: (1) What are the important challenges and themes highlighted in this scenario? and (2) How might I/we overcome these challenges as a lab group/department/institution/organization? We encourage open hydrologists to suggest additional challenges and scenarios that we may have missed by contributing to the living document (open-hydrology.github.io).

Number	Challenge	Categories	
1	Challenges surrounding navigating open hydrology resources, which may result in a lack	Socio-cultural	
	of confidence, fear of criticism, and decreased motivation to pursue open hydrology.		
2	Time spent practicing open hydrology is not supported, valued, nor rewarded and benefits	Socio cultural	
	may not be felt.	Socio-cultural	
	Lack of community to provide technical and motivational support addressing different		
3	experience and institutional levels (i.e., research group, departmental, institutional,	Socio-cultural	
	regional, global scale).		
4	Lack of power to advocate for open hydrology practices, e.g., resistance from senior	Socio-cultural,	
	colleagues and institutional policies.	Political	
	Unrecognized privileges within the research community (e.g., technologies, publications,		
5	limited access to funds, etc.) limit equitable participation in open hydrology, which further	Socio-cultural	
	exacerbates inequities and "gatekeeping".		

(A1) Table 1: List of common challenges that open hydrologists may experience.

	Lack of proper acknowledgement or citations of open hydrology resources (e.g., open data			
6	and code), which may result in limited sharing due to the fear of being scooped or not	Socio-cu	ltural	
	getting credit for work.			
7	Lack of incentive to publish iterations (i.e., lessons learned) in research approaches and	Socio au	1111101	
7	null and negative results.		Socio-cultural	
8	Limited documentation and sustained maintenance of publicly available data, code, etc.	Technol	ogical	
	Limited access to technical resources and/or physical facilities that are required for			
9	practicing open hydrology (e.g., cloud computing, stable internet connection, work	Technol	ogical	
	computer).			
		Technol	ogical,	
10	Prohibition and/or restriction of open-source software installation on work computers.	Organisa	tional,	
		Political		
	Lack of and/or limited funds to afford the high cost of open access publishing, which may	Organiza	ational,	
11	depend on complex institutional, regional, national, and global open science factors.	Econom	ic,	
	depend on complex institutional, regional, national, and global open science factors.		Political	
12	Restrictions on practicing open hydrology imposed by public and private institutional rules		Legal	
	and national policies.	Political, Legal		
13	Need to respect and honor privacy, data sovereignty, and data governance of stakeholders	Legal,	Political,	
15	and collaborators.		Socio-cultural	

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(A1) Table 2: Scenario summary table.

Letter	Scenario Title	Actor	Career level	Challenges
А	Knowledge of and Support for Practicing Open Hydrology	Jaime	Early career student	#1, #3
В	Collaborator Influence on Practicing Open Hydrology	Deniz	Established researcher	#2, #6, #12
С	Respecting and Upholding Stakeholder Interests	Alex	Principal investigator	#12, #13
D	Cost of Open Publishing	Robin	Postdoc	#4, #11
Е	Promoting a Culture of Open Hydrology	Dr. Hydro	Department head	#4, #5, #6, #9

Scenario A—Knowledge of and Support for Practicing Open Hydrology

Jaime is a Ph.D. student studying the impacts of irrigation strategies on groundwater levels. Jaime recently saw the terms "open science", "open access", "preprints", and "open-source software" used by hydrologists they follow

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on Twitter. No one in Jaime's lab/department has ever mentioned these terms and Jaime does not know where to go to learn more specifics or how to participate.

Knowing where to look, how to find, and how to use open science resources are fundamental skills of any successful open hydrologist and take time to learn. When knowledge of open hydrology resources and skills is accompanied by freely

- 535 accessible tools (e.g, code repositories, tutorials) and supportive communities, it becomes easier and less overwhelming to pursue open science strategies. It can be especially difficult when researchers face compounding socio-cultural challenges like Jaime in Scenario A. As an early career scientist, Jaime's ability to practice open hydrology is hampered by their limited knowledge of open hydrology resources (Challenge #1, Table 2) and limited (local) support (Challenge #3, Table 2). As a result, Jaime may feel overwhelmed, uncertain, and anxious about practicing open hydrology.
- 540 It is important to recognize that anyone, regardless of career stage, can become an open hydrologist. On a personal level, self-study can be an effective first step to learning about open science principles and tools. Set aside time to read papers on reproducible research, version control, etc. and practice putting what you learn into use. You can also attend free online seminars (e.g., R-Ladies Global meetups) or listen to podcasts (Podcasts, 2021; EOSC Podcast Special: Making Open Science FAIR For Researchers, 2021) to learn at your own pace. There are plenty of freely accessible resources on the web
- 545 that explain basic Open Science practices (Hampton et al., 2015; Allen and Mehler, 2019; European Geosciences Union, n.d.). Another important option is to reach out to friends (including those on social media), mentors, institutional staff (e.g., librarians, data managers), and colleagues familiar with practicing open science for tips on what resources they found helpful and why. They may even be interested in giving an introductory seminar or facilitating a lab group discussion. It may also help to engage with other like-minded early career scientists during institutional or professional society meetings. This way

550 you can learn from one another and support each other's open hydrology initiatives, like <u>https://open-hydrology.github.io</u>.

Scenario B—Collaborator Influence on Practicing Open Hydrology

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Deniz is an established hydrologist working at a government agency and is co-advising a Master's student in ecohydrology at a nearby university. In a recent committee meeting, the Master's student asked Deniz to post a preprint of their paper after it is submitted to the journal for review. The Master's student also asked if Deniz knew of places where they could post the dataset from their study upon acceptance to the journal. Deniz has an agency colleague with experience publishing datasets but was worried that preparing the datasets for publication might take the Master's student too much time. Also, Deniz needed to check if it was against agency policy to publish the paper before it was peer-reviewed. Not to mention, what if the non-peer-reviewed results were scooped by other scientists or used prematurely by decision-makers?

560 In Scenario B, a combination of socio-cultural, political, and legal challenges may come into play when practicing open hydrology at different career stages. Open hydrologists will likely encounter collaborators who are less supportive about practicing open hydrology. Limited enthusiasm may present itself throughout the research process, from sharing data and code to posting preprints, to paying for open access fees, and more. In Scenario B, Deniz's concern may be that time spent documenting and publishing data will outweigh long-term benefits (Challenge #2, Table 2), like the increased research

565 exposure and citations associated with open science. Fear of being scooped—when one researcher group publishes work before another doing similar work (Challenge #6, Table 2)—is a common reason for limited participation in open science (Laine, 2017). As Deniz supposes, research staff may also be subject to government agency policies that limit their ability to practice open hydrology (Challenge #12, Table 2).

Research supervisors and supervisees both play a critical role in the promotion and practice of open hydrology. If you are a supervisor, explicitly discuss and incorporate aspects of open hydrology into new, ongoing, and completed research collaborations to ensure research transparency. By keeping an open mind and candidly discussing practicing open hydrology when approached by your supervisee, a solution that addresses your and your supervisee's concerns and aspirations can be found. If you are a supervisee, provide your valid arguments for open hydrology, while still being considerate of your supervisor's concerns and honoring potential policies limiting open practices. One point to address can be highlighting the

- 575 potential long-term impact of open hydrology on your career (Allen and Mehler, 2019). Another approach might be to ask established open hydrologists to discuss with you and your supervisor their points of hesitation. For both supervisors and supervisees, reflect on each aspect of your research pipeline and how each adheres to open hydrology principles. Start with small changes and sustainably build on your open hydrology practices with each new project (Allen and Mehler, 2019). Furthermore, advocate for policy changes and long-term perspectives that value open hydrology practices. Time and effort
- 580 dedicated to making research more open is not a loss because it will benefit current and future research collaborators, stakeholders, and society.

Scenario C—Respecting Stakeholder Interests

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- Alex is a principal investigator conducting a sociohydrology research project in collaboration with local stakeholders who hold diverse beliefs on a particular issue impacting the region. Alex has had in-depth conversations with these stakeholders and all members of the project have agreed to participate in an anonymous survey that will assess their perspectives on the regional issue. In this project, Alex must protect personally identifying information when sharing results. Furthermore, Alex and the stakeholders have come to an agreement on specific data outputs and use cases that can be shared publicly; all other data and use cases are property of the stakeholders.
- 590 Since an increasing amount of hydrology research is conducted in collaboration with stakeholders, it is important to respect the rights and requests of these stakeholders (Challenge #13, Table 2), maintain stakeholder privacy (Challenge #12, Table 2), and adhere to research sharing agreements. In Scenario C, Alex must navigate a combination of political, legal, and socio-cultural challenges when conducting transdisciplinary hydrology research alongside communities.
- Open hydrologists can consider several strategies to uphold their commitment to transparency and reproducibility while respecting the rights and policies of their collaborators. Project leaders have a fundamental responsibility to spend time developing an open research plan with collaborators and stakeholders that describes public versus private research outputs,

use cases, and what will be shared to whom and when. Importantly, all impacted community members must co-produce this open research plan with the research team and consent to data collection, analysis, and dissemination. You can look at standard privacy guidelines, including the General Data Protection Regulation (GDPR),

600 2021) and data governance and data sovereignty principles (Carroll et al., 2020). Principle 2 discusses how to document decisions made and protocols around public research sharing so others can refer to this context and guidance can be found with the United Nations GEMStat program (Data protection GDPR, 2021). You may be able to share anonymized data such as metadata that does not indicate water quality issues for a specific geographic region.

Scenario D—Cost of Open Publishing

- Robin recently defended their Ph.D. thesis and started a postdoctoral researcher position. In their free time, Robin is finishing up an irrigation water management project that they worked on alongside agricultural producers during their Ph.D. research. Robin will present these findings to agricultural producers during a virtual webinar and wants to publish these findings in an open access journal article, so it is easier for people outside academia to find and read. However, Robin does not have enough grant funds to cover the expensive open access fees and feels uncomfortable asking their postdoctoral advisor, who is in a different sub-hydrology field, for these funds.
- Scenario D illustrates how distressing the lack of extra funds needed to pay open access publication fees (Challenge #11, Table 2), which is a common concern when practicing open hydrology. This scenario can be exacerbated when early career open hydrologists, like Robin, are transitioning between positions and projects and/or have limited power and resources to advocate for covering the cost of these fees (Challenge #4, Table 2). This inability to cover the cost influences the impact of the research because open access publications tend to be cited more (Wang et al., 2015) and are assuredly accessible to research partners and the general public. Open access publishing is a common and effective starting point for practicing open hydrology. Beyond challenges posed by being early in one's career stage, economic, political, and organizational challenges

may hamper efforts by researchers of all experience levels from developing countries.

- To overcome the challenges outlined in Scenario D established open hydrologists can start as early as possible in the research process to plan for open access publishing. The easiest solution is to look for an OA journal that does not charge an Article Processing Cost (APC) to the authors or any of the authors' institutions. You can budget funds to cover the cost of these fees in a grant, use discretionary funds, or cost-share with co-authors. In some cases, researchers who work for government agencies can retain the copyrights to their publications. More specifically, journals have special provisions to allow them to share the journal formatted paper without infringing on the journal's copyright laws. However, you should
- 625 check the policies for each journal as the corresponding author may have to be from the government agency and/or several co-authors may also have to be from a government agency to qualify. In other cases, journals waive fees and/or discounts to researchers from <u>certain countries</u> or <u>per individual requests</u>. You can also check the journal website and <u>publisher</u>'s <u>policy</u> to learn about your institution's or country's eligibility conditions. If you are an early career open hydrologist who was not present at the start of the research project, you can discuss the possibility of open access publishing with your supervisor.

630 Some libraries and institutions have dedicated supplemental funds to support researchers who choose to publish their papers as open access. If all else fails, researchers typically can post a plain copy of the journal article on a non-for-profit preprint server (e.g., <u>EarthArXiv</u>). This can be done at any stage of paper preparation, but all corresponding authors need to agree to post the preprint.

Scenario E—Promoting a Culture of Open Hydrology

635 Dr. Hydro is the faculty chair of an environmental sciences department and is providing mentorship and departmental support (e.g., funding for open access and technology fees, honors to researchers doing open science) to several graduate students and faculty members in the department who have started organizing discussion groups and developing training materials to promote short- and long-term open science practices within their research groups. Some members of the department feel like this is a waste of time, but Dr. Hydro thinks these are important initiatives that will benefit the members of their department and beyond, especially in the long term.

Unlike Scenarios A-D, Scenario E represents an example of a senior researcher supporting open hydrology efforts at their institute. Open science is a cultural movement, which ought to find deep roots in the hydrology community given the potential impact of our work on society. However, promoting a culture of open science requires individual- and community-based responsibility. We are each a part of a cultural shift towards open hydrology. At the individual level, researchers' roles

- 645 in open hydrology are crucial and diverse. In Scenario E, Dr. Hydro strives to overcome socio-cultural, technological, and political challenges to promote open hydrology in their department, institution, and beyond. Specifically, Dr. Hydro uses their position (i.e., power) as a department chair to advocate for open hydrology practices (Challenge #4, Table 2), ensures that all members of the department have equitable opportunities for practicing open hydrology (Challenges #5 and #9, Table 2), and promotes and honors community-driven open hydrology initiatives in the department (Challenge #6, Table 2).
- 650 Although this might seem like a huge challenge at the beginning, Dr. Hydro is convinced that these efforts will not only benefit the hydrologists at their institute but ultimately the entire field of hydrology, and society. Researchers interested in practicing open hydrology can organize or attend regular seminars or journal clubs, while early to

established researchers can learn about open science principles and ways to apply them to their work. Such a space can serve as a platform to discuss open hydrology, brainstorm solutions for common issues that are encountered. If you are a principal investigator of a research group, you can play an important role in promoting open hydrology by establishing guidelines for

your trainees. Finally, students, staff, and faculty can all promote the use of open-source software like R, Python, or QGIS for hydrology research and participate in local, regional, national, and global efforts to sport open science.