Using Glittr.org to find, compare and re-use online training materials

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Abstract

A wealth of excellent training materials on computational life sciences is scattered around the internet, but they can be hard to find. Many materials reside in public git repositories that are hosted on platforms such as GitHub and GitLab. Glittr.org aggregates and indexes such git repositories enabling users to find training materials that would otherwise be hard to identify. With the application, users can search and compare training materials based on topic and author, but also on engagement metrics like stargazers (bookmarks) and recency (days since last commit). Glittr.org currently contains 568 entries, which are assigned to six different categories within the field of computational life sciences. By analysing the database, we reveal insights in the availability of materials per topic, collaboration patterns of developers, and licensing practices. This knowledge helps to understand in which areas open training materials are lacking, the importance of git for collaboration on training materials and how licensing can be improved to enhance sharing and reuse. Taken together, we show that Glittr.org contains a wealth of connected and openly available metadata. Therefore, it enhances adherence to the FAIR (Findable, Accessible, Interoperable, Reusable) principles, which benefits the entire life sciences community.

Introduction

The life sciences domain is constantly growing and evolving, requiring professionals to be trained to stay up to date with the most relevant skills and knowledge. To facilitate this, various organizations deliver courses on a large range of topics in many different formats. Many course providers dedicate themselves to actively share their materials with the public, resulting in a growing wealth of public training materials available across the web. This greatly enhances the possibility to re-use these training materials, which is invaluable for both learners and lesson developers; learners can use the material on their own time to obtain required skills, while

lesson developers can use the existing material to build their courses further upon existing

ones.

To help developers make their shared material easier to find and re-use, the FAIR principles [1–

5] provide guidelines on organizing their materials and metadata. The way training material

metadata are represented depends on the platform where they are hosted. Currently, training

materials are hosted in diverse locations, like organizational websites, cloud storage, learning

management systems, and Git platforms (e.g., GitHub, GitLab). Therefore, metadata

representation often does not conform to standards, making it difficult to parse and utilize it

effectively. This issue can be relieved by aggregation and indexation, which encourages

metadata standardization and therefore enhances findability, re-usability, and integration of

metadata over multiple platforms.

Registries that currently aggregate and index training materials in the life sciences include the

Open Educational Resources (OER) Commons [6], the training portal of the Global Organisation

for Bioinformatics Learning, Education and Training (GOBLET) [7], and ELIXIR's online training

registry Training eSupport System (TeSS) [8]. These registries can accommodate any digital

object related to education that are accessible through an URL, making them potentially

comprehensive. However, this flexibility also comes with disadvantages. Since not every

webpage contains standardized metadata, it requires investments from the training material

developer to manually enter metadata at the registry or to automate metadata provision, for

example by implementing a standardized metadata markup like Bioschemas [9,10].

Using public git repositories for developing and hosting training materials is gaining popularity,

especially for materials related to (bio)informatics and data science. It is generally

recommended for reproducibility [11] and adopted by many institutions, communities, and

individuals (e.g. the Carpentries [12], Galaxy training network [13], the National Bioinformatics

Infrastructure Sweden (NBIS) and the SIB Swiss Institute of Bioinformatics. Having training

materials in public Git repositories has major advantages. First, using Git encourages

community-driven development. Git is version-control software, and as such, can be used to

track changes in files and associate these changes to individuals with distinct levels of

permissions. This makes it ideal for co-development and re-use of materials. Using git drives

community engagement by supporting direct feedback, suggestions, and corrections.

Secondly, the infrastructure around the most popular platform for public git repositories,

GitHub (https://github.com) and GitLab (https://about.gitlab.com), are standardized and

commonly used. Many people have the know-how to use version control, so the threshold to

use or learn how to use git for training material is low – especially in communities related to the

informatics field. Thirdly, public Git repositories offer standardized retrieval of a wealth of

metadata. Authorship, activity logs, and popularity metrics are all recorded and made

accessible through a single point of entry.

Despite many advantages, it remains difficult to find training materials on public git

repositories. Although both GitHub and GitLab have sophisticated search functionality, it

remains difficult to identify and compare repositories with training materials on a topic of

interest. The findability of repositories with training materials depends on the effort of the

author to describe the repository, for example in the repository description, the name, the

associated website, and repository tags. Since not all authors annotate their repositories

extensively and the way developers annotate repositories is not standardized, many

repositories with excellent training materials remain hard to find.

This article introduces Glittr.org, a novel web-based resource designed to enhance the

discovery and comparison of reusable bioinformatics training materials hosted on public Git

repositories. Addressing the needs of both students and trainers, Glittr.org contains intuitive

search functionalities based on pre-defined topics and repository metadata. This approach not

only facilitates the users' search based on specific topics but also the refinement of their

search based on factors like the training material's popularity and recency. Moreover, Glittr.org

supports the adherence to the FAIR principles by making all repository metadata readily

accessible through REST API endpoints, fostering findability and reusability of bioinformatics

training materials within the wider research community.

Materials and methods

Data collection and curation

Glittr.org is a manually curated list of bioinformatics training materials from anywhere in the

world and in any language. The list items are public GitHub or GitLab repositories. The teaching

aim of the material should be a general topic in bioinformatics, not tool usage – meaning that

inclusion of tutorials on using single software are discouraged. The reason for this is to ensure

Glittr.org provides an overview of metadata on training materials, and not on metadata related

to software. The quality of the training materials is not evaluated. Repositories that are

potentially eligible to be part of Glittr.org are identified from existing collections, internet

searches, specific searches on GitHub, (social media) promotions and user contributions

through a web form.

Repository metadata are retrieved from GitHub and GitLab. Among those are the repository

name, URL, repository description, author and contributor names, their profile and web site,

the number of stargazers (bookmarks), the date of the last push, and the license. These are all

programmatically accessible from the REST APIs of GitHub and GitLab.

To enable categorization and improve search functionality in Glittr.org, the training content in

the repositories are described with tags. These tags are based on existing ontologies as much

as possible. Using ontologies greatly enhances standardization and therefore knowledge

sharing. Training material in bioinformatics can cover a very wide range of topics, and using a

single ontology to describe them can be problematic. Glittr.org therefore uses multiple

ontologies, aiming to give an as rich as possible topic description for each repository. Currently,

the following ontologies are used: EDAM [14], Data Science Education Ontology

(http://www.pagestudy.org/DSEO/), Experimental Factor Ontology [15] and FAIR Data Train

Ontology (https://bioportal.bioontology.org/ontologies/FDT-O). If a term is considered relevant,

but not in any of these ontologies, a term will be used from any other ontology on BioPortal [16],

a software on bio.tools [17] or an item at Wikidata [18]. By using multiple ontologies, we have

the flexibility to annotate the wide range of training material, but still have good level of

standardization in relation to the relevant field.

Each repository is associated with one or more tags by a curator, where the order of tags

matters, meaning that the tag that describes the content best is first (the 'main tag') and is then

followed by other relevant tags all with equal importance. For example, for a single cell

transcriptomics course in R, the tag order could be 'Single-cell sequencing', 'R',

'transcriptomics' and 'RNA-seq'. The first and therefore main tag would be 'Single-cell

sequencing', which is used to categorize the material, while the others have equal importance

and are used to further describe the material. Each tag falls within a broader category, which

are maintained within Glittr.org. Currently, these are: (1) Scripting and languages, (2)

Computational methods and pipelines, (3) Omics analysis, (4) Reproducibility and data

management, (5) Statistics and machine learning, and (6) Others. The main tag of the above-

mentioned single cell course is part of the category 'Omics analysis' and so the course material

falls within this category.

Web application

The Glittr.org web application is created using the Laravel (https://laravel.com/) framework and

is written in PHP. Repository metadata is actively updated twice daily using Laravel jobs. This

approach enables handling of potential issues by implementing delayed retries if the

GitHub/GitLab APIs are temporarily unavailable. Each metadata update for a single repository

constitutes a dedicated Laravel job, with the overall management of all repository metadata

updates performed with the Laravel Haystack package (https://docs.laravel-haystack.dev/).

This package ensures job validation and sends email notifications in case of errors.

All the reactivity supporting list functionalities such as filtering, pagination, and sorting is based on

the Livewire (https://livewire.laravel.com/) framework. The JSON API endpoints for repositories and

Bioschemas are generated with the Laravel-query-builder (https://spatie.be/docs/laravel-query-

builder/v5/introduction) package developed by Spatie (https://spatie.be/open-source). This ensures

the query parameters and output results follow the JSON API specification as closely as possible. The

backend to manage data (topics and categories, repositories, submissions) is created with the

package Jetstream (https://jetstream.laravel.com/introduction.html).

All source code is accessible at https://github.com/sib-swiss/glittr and the website is available

through https://glittr.org. The application is a SIB Training resource and is hosted at servers

from SIB. As an institute with a long history of working with database life cycles, we are

committed to sustaining glittr.org for the time it is serving the community by aligning to the

TRUST principles [19].

A snapshot of the front-end website is found in Fig 1. The user can easily access both the

repository with course material and the course web site (when applicable). In addition, a link to

public information about the author or organization that created the material is provided to

retrieve more author information. The topics (tags) covered by the material allows users to

quickly find course material relevant to their search. The number of stargazers estimates the

popularity of the repository, while the number of days since the last push provides an indication

of the recency of the material in the repository. The license which applies to the repository

contents indicates to trainers wishing to re-use the material what conditions apply.

Fig 1. Snapshot of Glittr.org. Here, two tags are selected 'Transcriptomics' and 'R', showing the (current)

top 2 of 25 repositories with both tags. By default, results are sorted based on number of 'stargazers', i.e.

bookmarks.

The application currently has three REST API endpoints in which data stored by Glittr.org can be

programmatically accessed: api/repositories, api/tags and api/bioschemas. The

api/repositories endpoint contains all repositories including their metadata as presented on the

website. The repositories/tags endpoint contains tag metadata organized by their

corresponding category. Tag metadata consists of the ontology, ontology class and description.

The api/bioschemas endpoint contains repository and tag metadata according to the

Bioschemas [9] TrainingMaterial profile [10] (https://bioschemas.org/profiles/TrainingMaterial).

169 **Training material characteristics**

To give an overview and statistics of all the metadata stored on Glittr.org, we used the R httr2

package to access the Glittr.org REST API (see above). Public information on authors, and

number of contributors was extracted from the GitHub REST API. Location of authors and

organization was extracted from the 'location' field within the users API. This string was

translated in a country with the R package geocode, which has wrappers for the Google

Geocoding API. The source code for acquiring the statistics can be found at

https://github.com/sib-swiss/glittr-stats and the report can be approached through https://sib-

swiss.github.io/glittr-stats/ (updated weekly).

Results and Discussion

There are currently 568 repositories listed on Glittr.org. By combining data from our REST APIs

and those of GitHub and GitLab we can give a detailed insight in these repositories. In the first

part of this section, we show what kind of repositories with training material are currently

available, for which topics training materials exist, what licenses are used, and by whom the

repositories are created. In the second part we present several use-cases on how different

types of users can interact with Glittr.org to show how trainers, learners and developers can

use different functionalities of glittr.org.

Training material topics

Repositories on glittr.org are categorized in six categories and tagged with 55 different topics.

All are connected to bioinformatics, but many are not specific to bioinformatics: for example,

computer languages are relevant to informatics in general, and statistics to all fields related to

science. Therefore, using glittr.org is relevant to a broader public than just persons working in

the field of bioinformatics. In this section we give a brief overview of popular categories and

topics.

By far most repositories currently on Glittr.org have 'Scripting and languages' as main category

– 315 in total (Fig 2A). Within this category, R [20] is the most frequent tag with 230 repositories,

followed by Python with 81 repositories (Fig 2C). This suggests that the R language is currently

the most popular language to teach and therefore probably to learn in bioinformatics, with

Python coming in second. The popularity of R might not be the only reason; the ease with which

one can host static websites within the R framework, with e.g. bookdown [21] or Quarto

(https://quarto.org/), could also explain this.

Fig 2. Key statistics by category. Overview of number of repositories by category (A), distribution of
number of contributors per repository by category (B), number of repositories per tag, square root
transformed (C), per author or organization (D) and per license (E). Colours are according to category as
depicted in (A). In C) only the tags with more than 10 repositories are displayed and in D) only the
authors/organizations with five or more repositories. At time of writing Glittr.org contained repositories

The category 'Omics analysis' is specific to the field of bioinformatics, and many repositories

fall within this category. 'Transcriptomics' is the most frequent tag (74 repositories), followed by

'RNA-seq', suggesting an important place for transcriptomics-related courses in current

bioinformatics curricula. Transcriptomics analysis skills are popular to acquire, likely because

it is one of the most used applications of next generation sequencing, it is applied in many fields

in biology [22] and each experiment requires its own analysis choices. Its demand is well served

by the vast amount of material available on transcriptomics.

There are 34 repositories on 'Data management', representing its growing importance within

the scientific community regarding trends in open and FAIR data. Using public git repositories to

develop training materials on data management related topics, is likely to be of particular

interest because using git supports transparency and community-based development. Efforts

that support open and reproducible science like the ELIXIR Research Data Management (RDM)

community, European Open Science Cloud (EOSC) and other research infrastructures likely

influence this trend towards using git repositories for training materials both on data

management and other topics.

The number of repositories and their diversity show that there is a wealth of public repositories

with bioinformatics training material. For many topics, there are high-quality materials in

different formats, giving lesson developers and learners many possibilities to re-use existing

training materials. Glittr.org organizes this wealth of materials, making them better findable and

therefore available for re-use.

Collaboration

An important advantage of using version control for training materials is that it supports

collaboration and building further on existing material. This is also represented in the number of

collaborators per repository that are on Glittr.org. Most repositories (78.8%) have more than

one contributor, meaning the repository is developed by more people than the original author.

Many repositories have only a few contributors, between 1 and 5 (59.9%). However, quite a

large fraction (25.6%) has more than 10 contributors, showing that these repositories gain from

a strong community involvement and therefore increased (re-)usage and quality.

Repositories in the category 'Reproducibility and data management' and 'Computational

methods and pipelines' have the largest fraction of repositories developed by a large

community (> 50 contributors; Fig 2B). Repositories with a large contributor base within these

categories are e.g. elixir-europe/rdmkit - which is a community-created website with RDM best

practices [23], galaxyproject/training-material – the Galaxy training network repository with all

training materials related to Galaxy [13] - or are forked from a repository with a large community

base (e.g. a template from the carpentries [12]). This shows that large and important initiatives

rely on git for the development of training materials and that these thrive by cooperation.

Authors and organizations

The origin of repositories on Glittr.org is very diverse; currently, the 568 repositories originate

from 263 different GitHub/GitLab authors or organizations. The organization with most

repositories is the carpentries-incubator [12], followed by two national institutes, NBIS and SIB

(Fig 2C). Obviously, the distribution of repository category varies per organization/author.

Bioinformatics institutes, like bioinformatics.ca, Instituto Gulbenkian de Ciência (GTPB), CRUK

CI (bioinformatics-core-shared-training), Harvard bioinformatics core (hbctraining), UC Davis

Bioinformatics Core (ucdavis-bioinformatics-training), SIB and NBIS, are more focused on

computational biology and have more courses in the category 'Omics analysis'. Other popular

namespaces like carpentries incubator [12], the '23 posit conference (posit-conf-2023) and

learn by example (learnbyexample) are focused on computer skills and therefore have mostly

repositories on 'Scripting and languages' and 'Computational methods and pipelines' (Fig 2C).

In addition to the number of authors, the number of countries the authors affiliate themselves

with is also diverse. Current repositories on Glittr.org originate from 24 different countries. Most

repositories with the main author or organization having a country defined in its profile originate

from the United States, followed by Switzerland and Canada (Fig 2F). This shows that most

training materials originate from the Western and particularly English-speaking parts of the

world. English is currently the 'lingua franca' of the academic world [24], and most training

materials in bioinformatics reflect that. Connections between the academic ecosystem and

training materials not written in English can be literally lost in translation, and therefore hard to

identify. However, there are many communities that demand non-English bioinformatics

training material, and we are open to serving these communities by listing them on Glittr.org.

Organization of the curation of repositories in other languages is more challenging because it

relies on reading and understanding the content, but we encourage initiatives in this direction.

268 Licensing

Although licensing is an important way to enable and encourage re-use, licensing of public

training materials on GitHub and GitLab is not very standardized. Fig 2B gives an overview of

licenses per repository that could be recognized as such. For many repositories (172; 30.4%),

there is no license detected, and for 211 (37.3%) repositories the license could not be

automatically recognized. The most popular recognized license is the MIT license, a software

license. The copyright licenses based on Creative Commons (CC) are also quite popular, 75

repositories have a license recognized as such. Since training materials generally consists of

text, presentations, and exercises, and not software, it is usually more appropriate to use a

copyright license instead of a software license [4,11]. It therefore seems that many developers

of training materials might want to (re-)consider their license.

Use cases

280 Glittr.org has been developed for use by bioinformatics students, trainers, lesson developers

281 and database developers. To showcase different applications of the resource, we present five

282 different use cases that we have envisaged for Glittr.org. The first four use cases illustrate the

283 ease of use, as only a single click is necessary to obtain an answer, while the last one shows

284 how to retrieve information programmatically.

A student looking for training materials

Our first use case is that of a student looking for training materials, for instance someone

wishing to learn the programming language Julia. This high-level, general-purpose dynamic

programming language used for numerical analysis and computational science is usually

offered in university and higher order education curricula. Using the 'Filter by topic' option to

select Julia under the 'Scripting and Languages' section, only repositories which have been

manually assigned the topic are retrieved. The top result is the most popular as, by default, the

results are displayed in order of decreasing number of stargazers. It is also possible to sort by

increasing number of days since the last push to find material which has been recently

updated. The link to the website takes the student directly to the page showing the different

options to get started with Julia. Glittr.org thus allows students to quickly access the most

popular, public course material on the subject.

A trainer looking for material for re-use

298 This use case is that of a trainer who will be teaching a course on Snakemake and is looking for

299 materials that can be re-used. Snakemake is a workflow management system to create

300 reproducible and scalable data analyses. Selecting Snakemake in the Computational methods

and pipelines section of the 'Filter by topic' option retrieves several repositories with materials

to teach Snakemake. By looking at the license column, the trainer can easily spot that there are

two repositories that contain material that have a re-use permissive license, one under the

Creative Commons Attribution-ShareAlike 4.0 International license (CC BY-SA 4.0) and another

under the GNU General Public License version 3 license (pl-3.0). For other repositories in the

list, the license could not be automatically identified, and therefore the license has been

indicated as 'other'. For these repositories some further investigation is needed before they can

be re-used. The trainer has quickly found re-usable material on the topic of interest using the

Glittr.org web site.

A trainer sharing their own materials

The third use case is that of a trainer who has developed a course on a hot topic in

bioinformatics on GitHub or GitLab and wishes to share the material. Contributions to the

Glittr.org web site from the training community are welcome and encouraged. The Contribute

button on the top right of the home page (Fig 1) links to a simple form. By completing the

submission form, the trainer's repository will be added (or updated) to the collection provided it

meets the inclusion criteria (public GitHub or GitLab repositories containing bioinformatics

training material). The trainer's material is now findable by being included in the Glittr.org web

site. Obviously, this does not prevent the trainer from posting the material in other repositories

which is, in fact, recommended by the FAIR principles (the more the material is registered,

more chances are that they are findable).

A database developer wanting to programmatically access Glittr.org

A final use case is that of a developer who must programmatically access one or more subsets

of training materials repositories on Glittr.org. This can easily be done using the API endpoints

(https://github.com/sib-swiss/glittr#api) and applying suitable filters. For example, the data for

the graphs in Fig 2 are all extracted from the Glittr.org API with the R packages httr2 [25]. The

326 Bioschemas endpoint is a special API endpoint in Glittr.org. It provides access to the metadata

327 of all the repositories in Glittr.org in Bioschemas TrainingMaterial markup. This allows portals

328 that can ingest Bioschemas markup to re-use Glittr.org data. For example, ELIXIR TeSS [8],

329 currently ingests this metadata (https://tess.elixir-europe.org/content_providers/glittr-org).

Conclusion

When we created Glittr.org, our aim was to create a simple-to-use, web-based listing of

bioinformatics training materials available on GitHub/GitLab because as training providers we

saw the need for such a tool. Within one year, more than 500 repositories with bioinformatics

training materials with a diverse set of topics have been included in Glittr.org. By focussing only

on git repositories, Glittr.org can automatically display relevant information like popularity,

license and recency that would otherwise not be possible. The resource has the potential to

help in training material selection, decision-making by both students and trainers and training

material database integration, as illustrated by the five use cases presented. All the information

is available programmatically via the API and Bioschemas markup thereby enabling other

training registries to freely update their existing entries or add entries not yet present in their

database. This will further increase the coverage of these registries and promote the findability,

accessibility, interoperability, and re-usability (FAIRness) of training materials in the life

sciences.

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