



# FAIR data for reproducible research

Lunch&Learn Open Science, September 23

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# Goals of the Center for Reproducible Science (CRS)

1. **Teaching and training** to improve the overall reproducibility and quality of empirical research



- **Good Research Practice (GRP)** courses
- **Primers** in Good Research Practice
- **ReproducibiliTea** journal club
- **Reproducibility Lab Pitches**

2. Promote, support and conduct **original research** in reproducibility and methodology



- Design and analysis of **replication studies**
- **Meta-research**

more infos, see  
[www.crs.uzh.ch](http://www.crs.uzh.ch)

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**They may include**, for example, **statistics**, collections of **digital images**, **sound recordings**, **transcripts** of interviews, **survey data** and **fieldwork observations** with appropriate annotations, an **interpretation**, an **artwork**, **archives**, **found objects**, **published texts** or a manuscript.

**The primary purpose** of research data is to provide the information necessary to support or validate a research project's observations, findings or outputs.

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+ code, software, protocols and methods

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# University requirement

## UZH Open Science Policy

*UZH expects that all publicly funded scholarly output – including, e.g. publications, research data and code – is made openly available.*

*UZH expects output of all publicly funded research to be made FAIR (Findable, Accessible, Interoperable and Reusable). The FAIR principles apply to data and metadata as well as to software, code, algorithms, and workflows/protocols that lead to that data.*

**OPEN  
BY  
DEFAULT**

Open Science Policy



# SCIENTIFIC DATA

Amended: Addendum

**OPEN**

SUBJECT CATEGORIES

- » Research data
- » Publication characteristics

## Comment: The FAIR Guiding Principles for scientific data management and stewardship

Mark D. Wilkinson *et al.*<sup>#</sup>

There is an urgent need to improve the infrastructure supporting the reuse of scholarly data. A diverse set of stakeholders—representing academia, industry, funding agencies, and scholarly publishers—have come together to design and jointly endorse a concise and measurable set of principles that we refer to as the FAIR Data Principles. The intent is that these may act as a guideline for those wishing to enhance the reusability of their data holdings. Distinct from peer initiatives that focus on the human scholar, the FAIR Principles put specific emphasis on enhancing the ability of machines to automatically find and use the data, in addition to supporting its reuse by individuals. This Comment is the first formal publication of the FAIR Principles, and includes the rationale behind them, and some exemplar implementations in the community.

Received: 10 December 2015

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# The FAIR principles

**F**indable

**A**ccessible

**I**nteroperable

**R**eusable

# The FAIR principles

## Findable

- (meta)data should have a globally unique and persistent identifier (DOI)
- well described metadata
- (meta)data should be registered (Zenodo, Open Science Framework, ...)

Can I find it, also in a year from now?

## Accessible

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Can my colleague access it, without paywall, or other obstacles?

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## Interoperable

- (meta)data should use a formal, accessible, shared and broadly applicable language

Can my colleague interact with the data, do they understand and find all relevant information?

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## Reusable

- (meta)data with clear and accessible usage license and detailed provenance

Will a potential future collaborator be able to re-use my data, without contacting me?

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3. Long-term data maintenance
  - Training and data stewardships
4. Open and FAIR data sharing *is not enough*
  - Additionally share code, software, and all research material

# What is Metadata?

Metadata is **data about data**, that

is machine readable.

makes data FAIR - *findable, accessible, interoperable, and reusable*.

facilitates data reuse and discovery.

contains a data-dictionary or codebook defining and explaining variable in the data.

# Start planning your data management



## **Start planning your data management**

Data management plans (DMPs) are more and more required (funders, publishers, ...).

UZH Library provides lots of support.

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UZH Library provides lots of support.

From researcher to researcher - this will save you lots of trouble along the way!

## Data management planning

**What goes in a DMP?:**

# Data management planning

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- What type of data will be reused / generated?
- What is the purpose of data reuse / generation?
- What is the data provenance and origin?
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- Strategy for sharing? Where? What?
- Strategy for quality control?
- Ethical considerations and data privacy?

## **Data management planning - My suggestion**

Start with defining data, and list the types of data you generate and reuse.

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## *I generate*

- R scripts
- research protocols
- papers and preprints
- teaching material

## *I reuse*

- R code and packages
- openly accessible data



# Data management planning - My suggestion

## Quality control?

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# Data management planning - My suggestion

## Quality control?

### *I generate*

- R scripts: **code review and version control**
- research protocols: **follow reporting guidelines and templates**
- papers and preprints: **reporting guidelines, use community approved vocabulary, engage with pre-/post-publication peer review**
- teaching material: **option for feedback / test material**

### *I reuse*

- R code and packages
- openly accessible data

# Data management planning - My suggestion

## Strategy for sharing?

### *I generate*

- R scripts: *via git, with snapshot on Zenodo for DOI*
- research protocols: *preregistration on the Open Science Framework (with DOI)*
- papers and preprints: *post preprint before submission, prefer OA journals*
- teaching material: *upload to the OSF (with DOI)*

### *I reuse*

- R code and packages: *properly cite all packages and sources*
- openly accessible data: *ensure data has a license*

# Data management planning - My suggestion

## Metadata? Documentation?

### *I generate*

- R scripts: [comments in code](#), add examples for usage, add README and [license](#)
- research protocols: [is documentation + minimal metadata via OSF + license](#)
- papers and preprints: ...
- teaching material: [description of learning objectives](#), add license

### *I reuse*

- R code and packages
- openly accessible data

**Thank you.**

Question?

Comments?