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<http://tiny.cc/fairdatamaribor>

Hi, I am Paola!
I am a data
scientist, Open
Science advocate
and independent
researcher at
IGDORE



Dealing with FAIR Data



University of Maribor
Open Science Summer
School
12th September 2023

some disclaimers and practicalities

- The web is full of resources, and by no means this workshop covers them all (not even close!) - I have prepared some reading material for you at the end of this presentation
- You think you don't produce data / you don't have anything to make FAIR? You'll soon change your mind ;)
- A **marker** will indicate when it's time to get our hands dirty (looking up stuff online, browsing a database, using software, etc.)



we'll use a collaborative pad

<http://tiny.cc/maribor>

Please use it to share comments, questions, etc.
I will copy-paste useful stuff in there, and you can then copy-paste these on your laptop :)

Welcome to this space!
Please enter your name, if you want, using the little icon on the right side - you'll get assigned a color, and you can start writing down here :)

Please be considerate of each other, kindness and respect are a must, way more than FAIR data ;)



the (rough) agenda

Introduction to research data and FAIR - 12h15-12:45

The FAIR principles in action - 13h00-14h00

F for Findable

A for Accessible

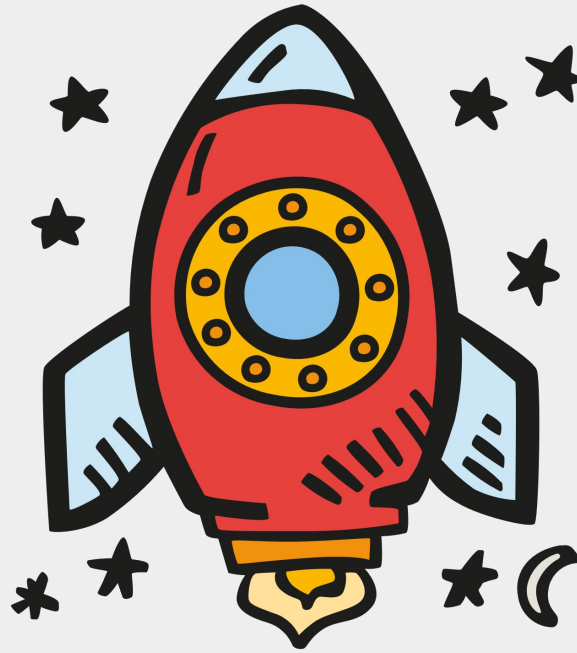
I for Interoperable

R for Reusable

Lunch 14h00-15h00

FAIRify (your) data - 15h00-16h15

LET'S GO!



the (rough) agenda

Introduction to research data and FAIR - 12h15-12:45

The FAIR principles in action - 13h00-14h00

F for Findable

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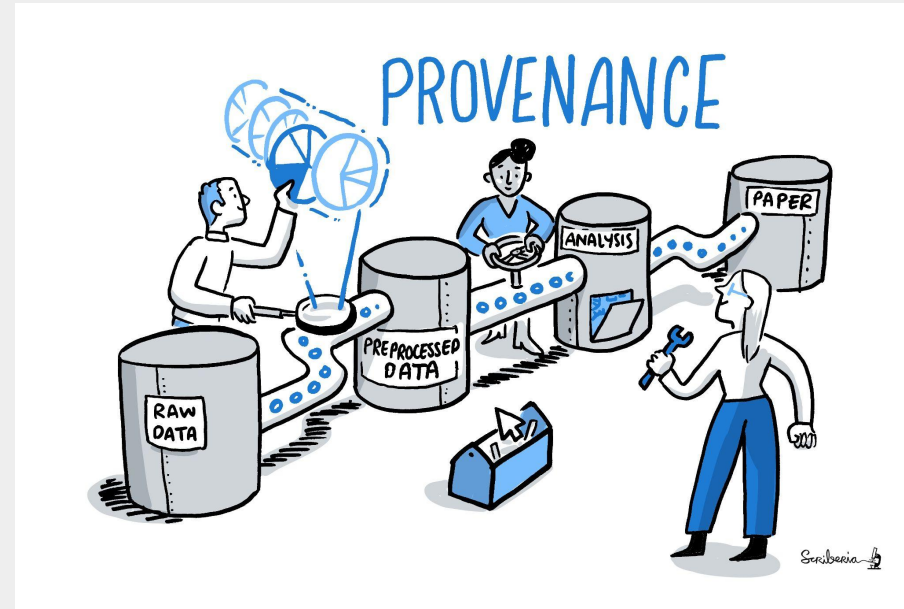
Lunch 14h00-15h00

FAIRify (your) data - 15h00-16h15

what is research data?

Research data: any type of information created, collected, observed, in the context of research

- **Primary:** raw data from measurements or instruments
- **Secondary:** processed from second-order analysis and interpretation
- **Published:** final format available for use and reuse
- **Metadata:** data about the data



examples of research data



```

71 //fires the appear event when appropriate
72 var check = function() {
73   //is the element hidden?
74   if (!t.is('visible')) {
75     //it became hidden
76     t.appeared = false;
77     return;
78   }
79
80   //is the element inside the visible window?
81   var a = w.scrollLeft();
82   var b = w.scrollTop();
83   var o = t.offset();
84   var x = o.left;
85   var y = o.top;
86
87   var ax = settings.accx;
88   var ay = settings.accy;
89   var th = t.height();
90   var wh = w.height();
91   var tw = t.width();
92   var ww = w.width();
93
94   if (y + th + ay >= b &&
95       y <= b + wh + ay &&
96       x + tw + ax >= a &&
97       x <= a + ww + ax) {
98     //trigger the custom event
99     if (!t.appeared) t.trigger('appear', settings.data);
100   } else {
101     //it scrolled out of view
102     t.appeared = false;
103   };
104
105   //create a modified fn with some additional logic
106   var modifiedFn = function() {
107     //mark the element as visible
108     t.appeared = true;
109
110     //is this supposed to happen only once?
111     if (settings.one) {
112       //remove the check
113       w.unbind('scroll', check);
114       var i = $.inArray(check, $.fn.appear.checks);
115       if (i >= 0) $.fn.appear.checks.splice(i, 1);
116     }
117
118     //trigger the original fn
119     fn.apply(this, arguments);
120
121     //bind the modified fn to the element
122     t.one('appear', settings.data, modifiedFn);
123   };







```



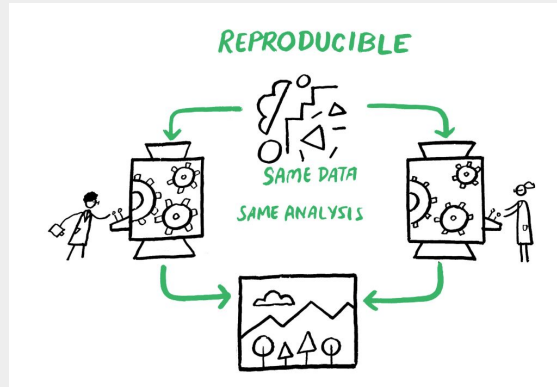
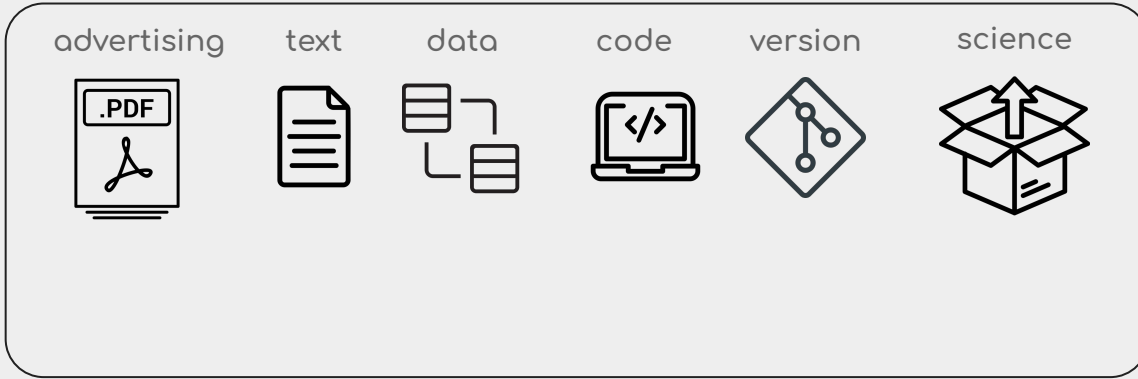
the Open Science movement
encourages researchers to share
research output beyond the contents
of a published academic article

the Open Science movement
encourages researchers to share
research data beyond the contents
of a published academic article

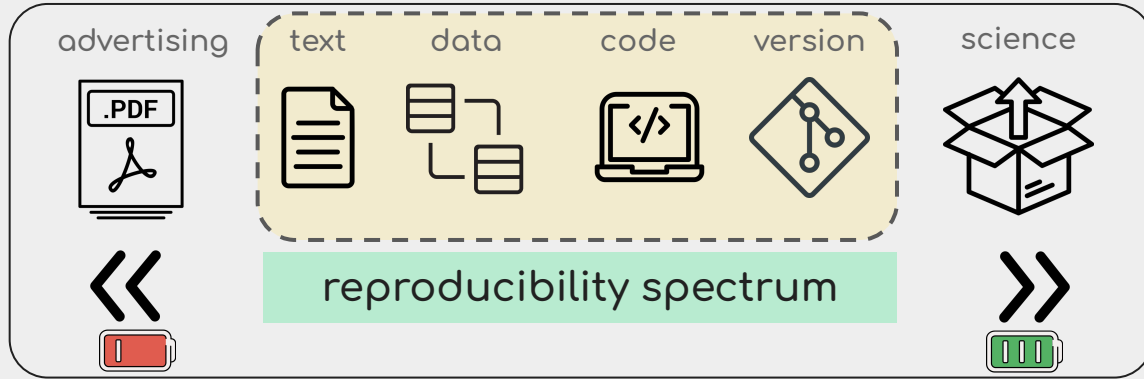
research is much more than a PDF

advertising	text	data	code	version	science
					

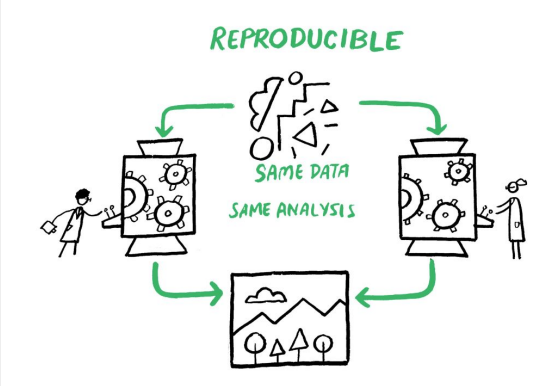
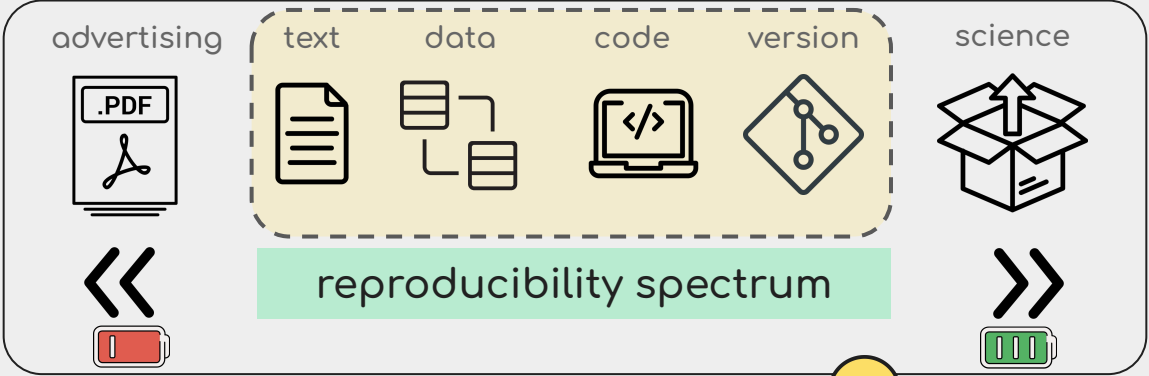
reproducibility: minimum standard for research validity



reproducibility: minimum standard for research validity



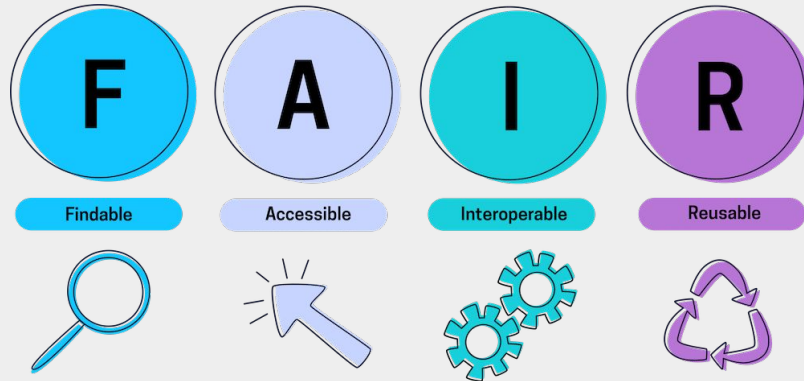
data as substrate for knowledge discovery



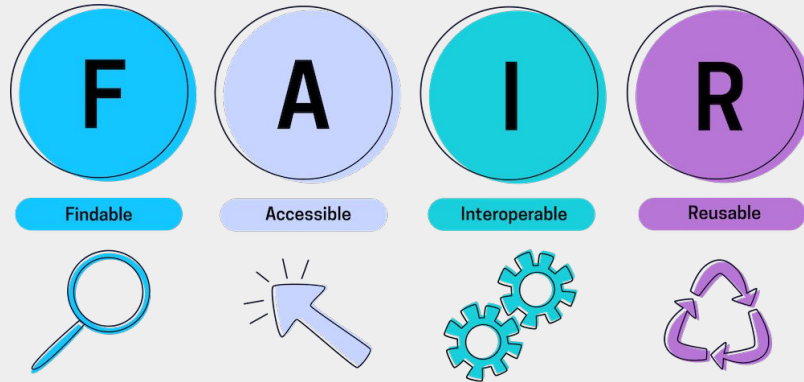
objects that belong together should be linked to each other (and other objects), so that they can be discovered on the web

the FAIR principles as guidance for data stewardship

the FAIR principles have been designed to assist **discovery** and **reuse** of research objects through the web



the FAIR principles as guidance for data stewardship

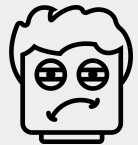


the FAIR principles have been designed to assist **discovery** and **reuse** of research objects through the web

FAIR comes in degrees

FAIR is agnostic of technical implementations

FAIR requires work!



FAIR is not the same as OPEN

open data: a definition

Open data is data that can be freely used, re-used and redistributed by anyone - subject only, at most, to the requirement to attribute and sharealike.



Open Knowledge
Foundation

the 5 star open data model

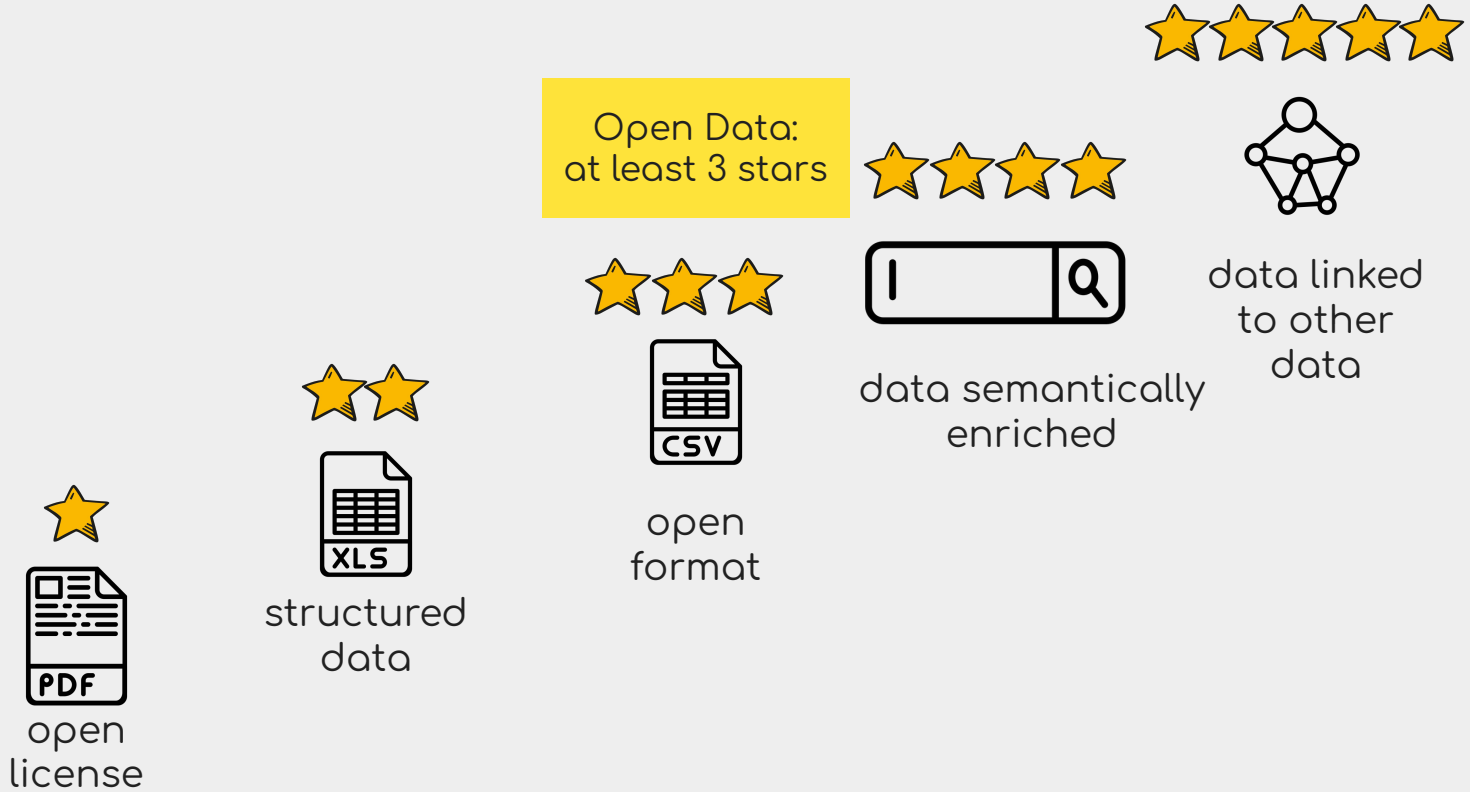


data semantically enriched



data linked to other data

the 5 star open data model



open data is not FAIR data, and vice versa

FAIR is not equivalent of OPEN, but OPEN data needs to be FAIR to be useful

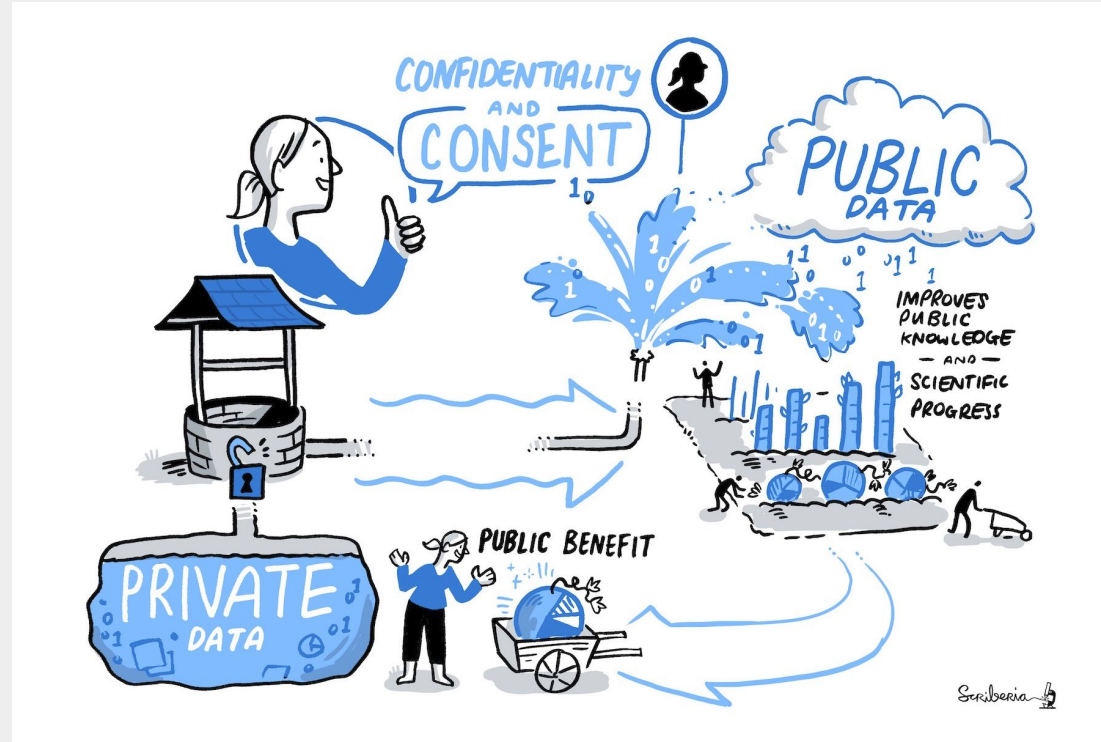
Making your data freely available on the web doesn't translate to it being reusable

FAIR is not the same as OPEN

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Even confidential and highly protected datasets can be FAIR

⇒ as open as possible, as closed as necessary



open data is not FAIR data, and vice versa

FAIR is not equivalent of OPEN, but OPEN data needs to be FAIR to be useful

Making your data freely available on the web doesn't translate to it being reusable

Even confidential and highly protected datasets can be FAIR ⇒ as open as possible, as closed as necessary

Ideally, you want FAIR data shared openly!

the research data life cycle



the research data life cycle

Ideally, you start thinking about FAIR data even before you start collecting them! This is where you design your Data Management Plan.



the research data life cycle



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Data collection is where the data is created, either by collecting new data, or locating existing data, for example reusing someone other's data.

the research data life cycle

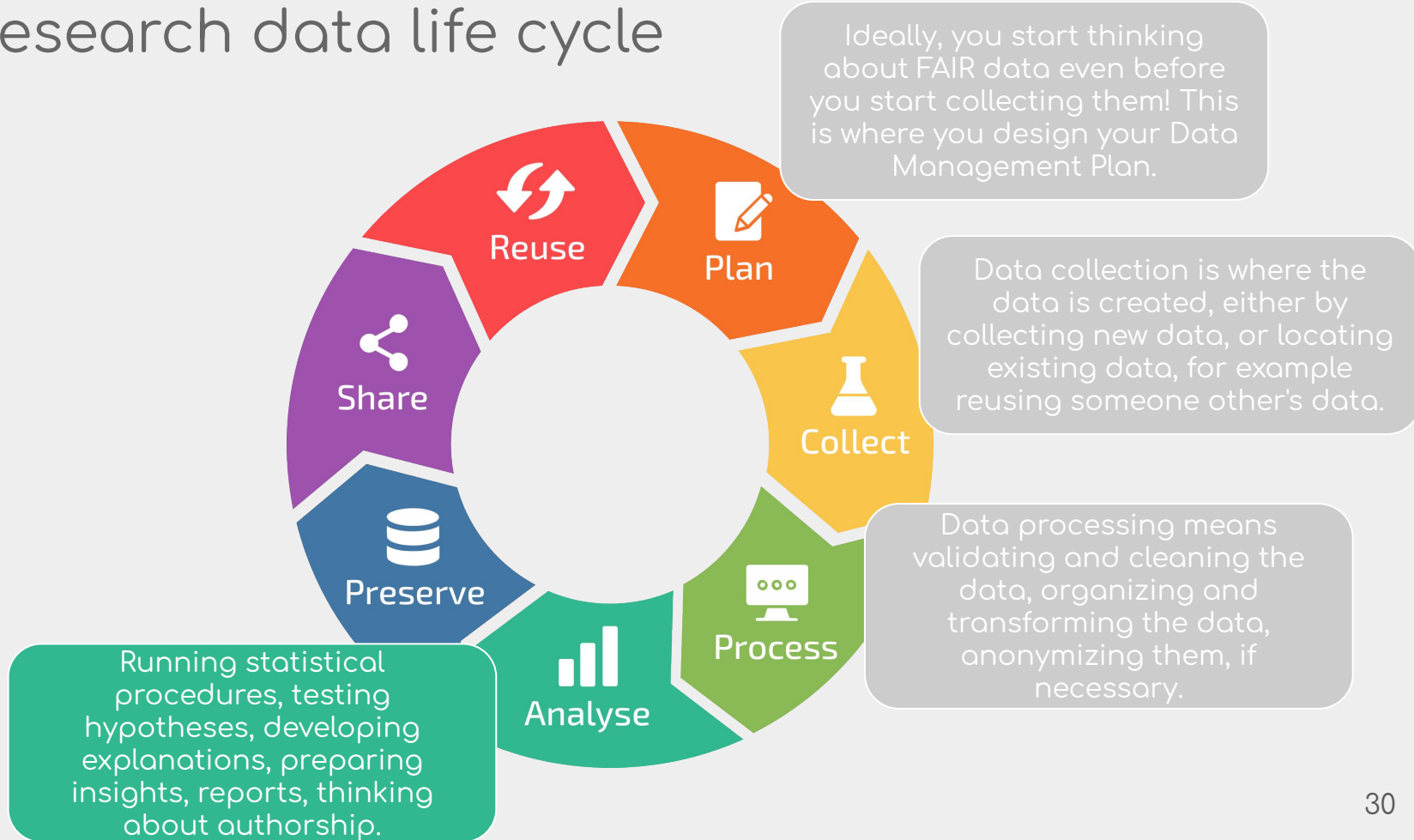


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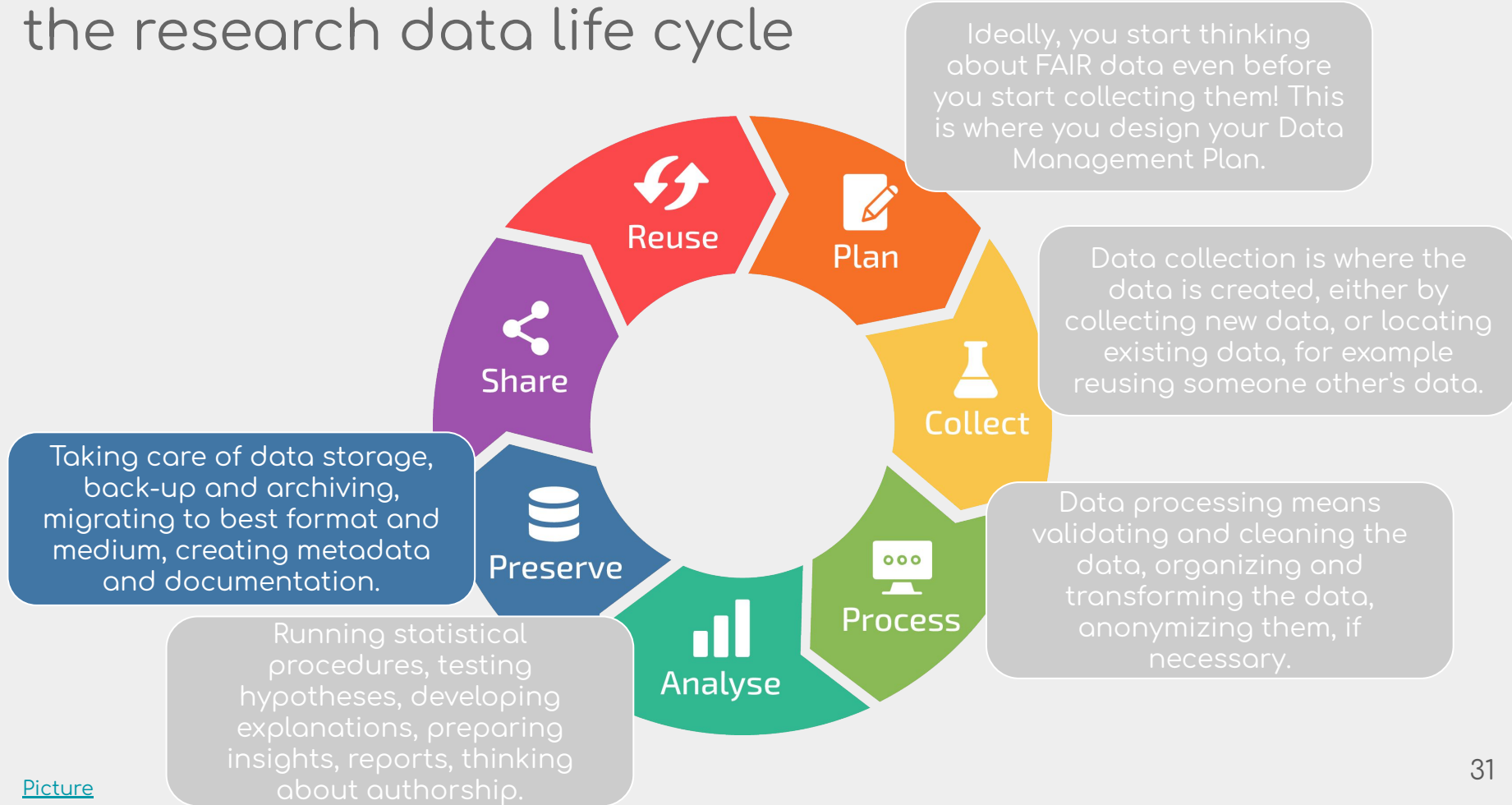
Data collection is where the data is created, either by collecting new data, or locating existing data, for example reusing someone other's data.

Data processing means validating and cleaning the data, organizing and transforming the data, anonymizing them, if necessary.

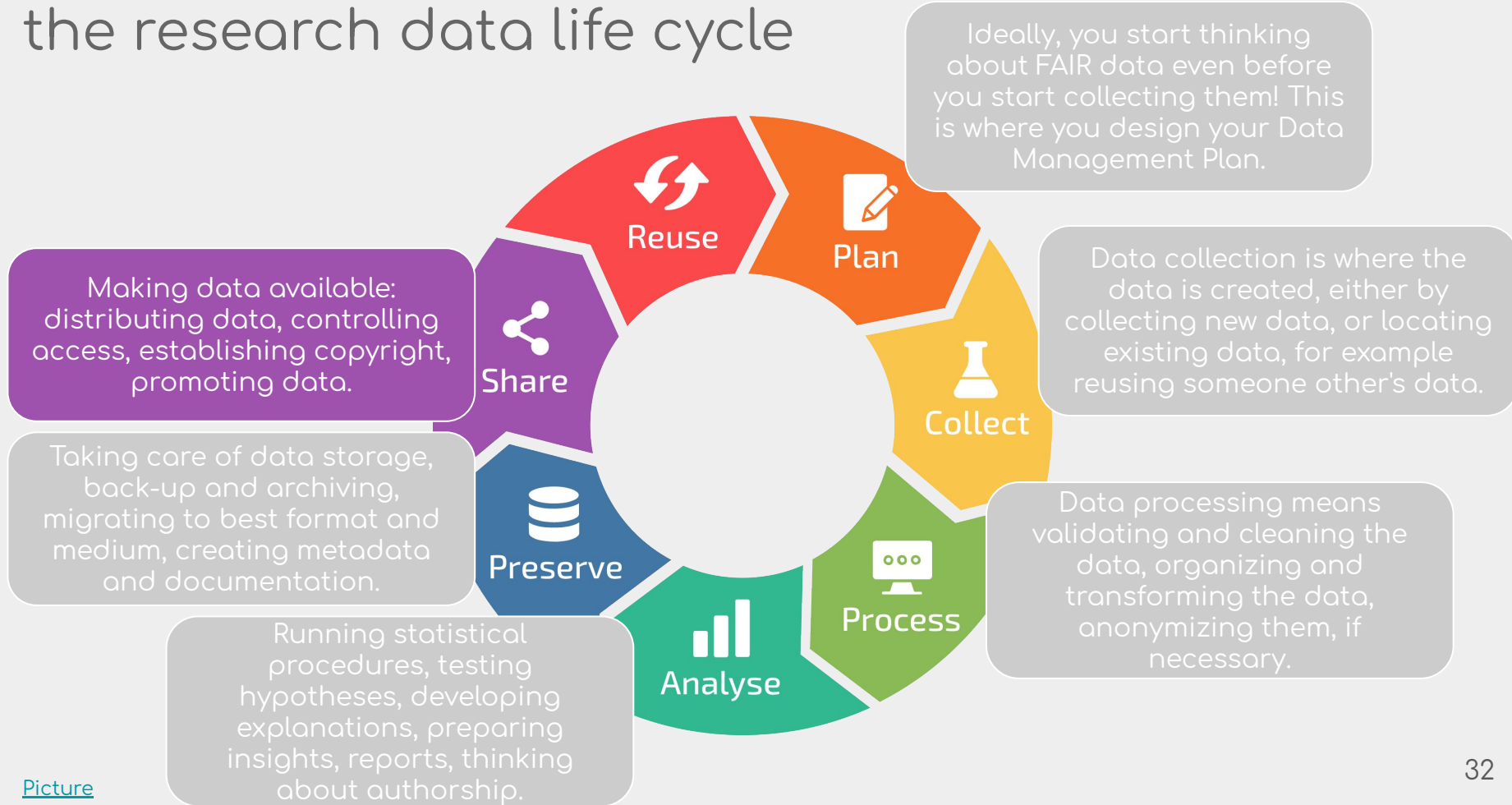
the research data life cycle



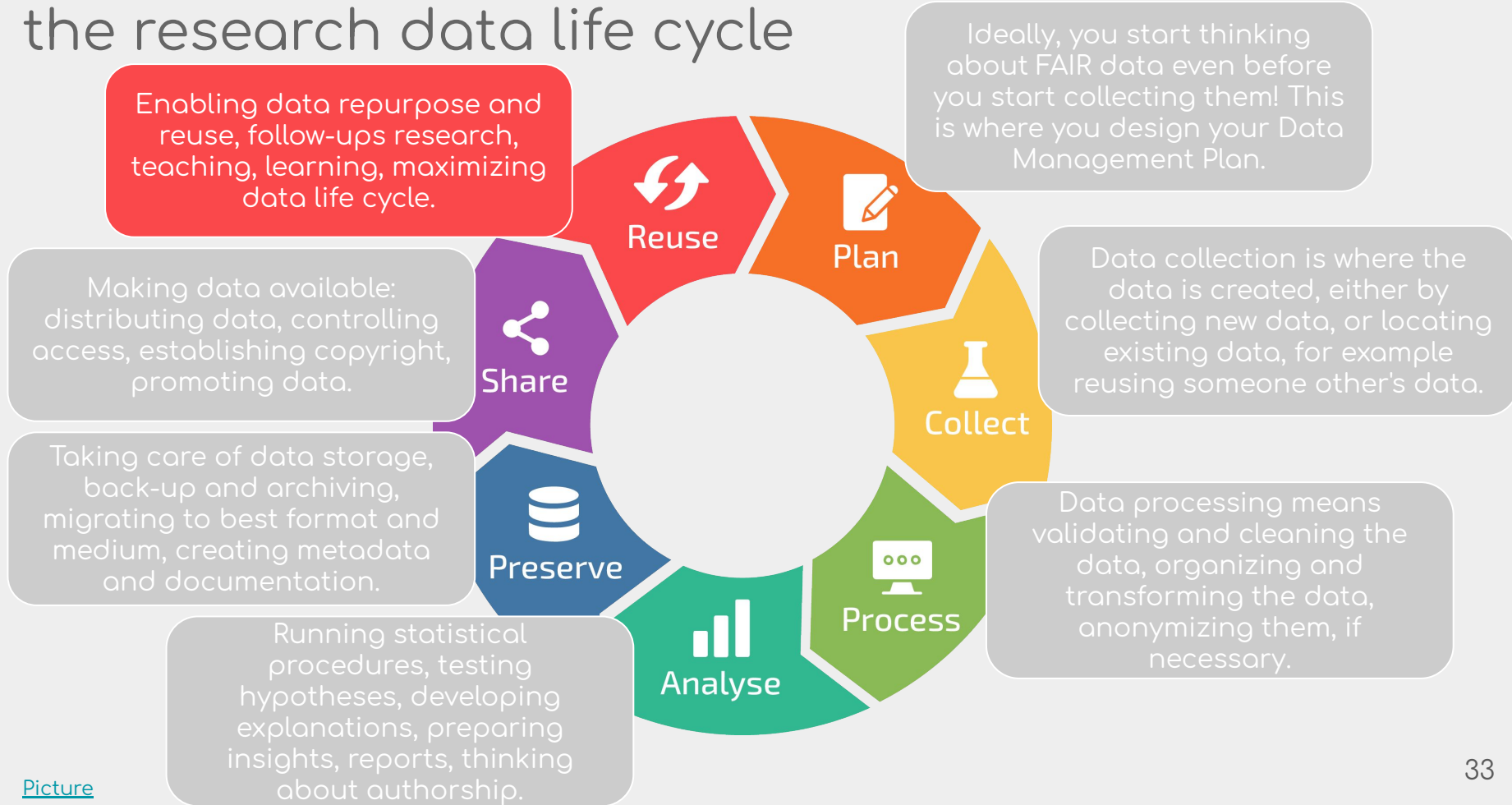
the research data life cycle



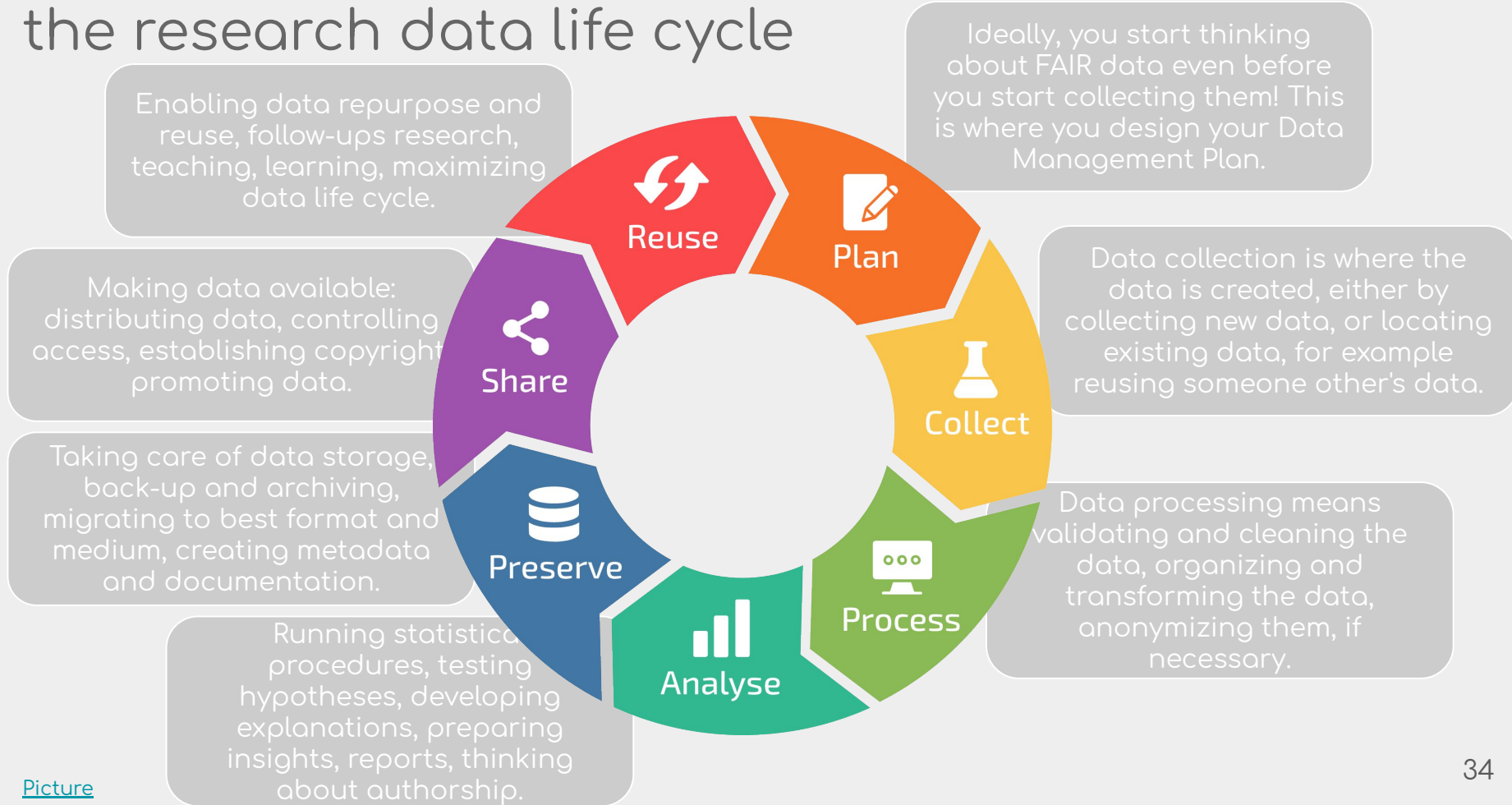
the research data life cycle



the research data life cycle



the research data life cycle



data terminologies (1)

deposit data: upload a digital object on a platform that allows to correctly describe it through its metadata, and that implements long-term preservation

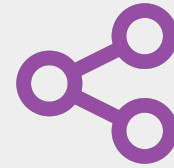


give access to data: once the object has been deposited somewhere, it's up to you to choose which type of access you want to grant (through licenses, which we will see later)



data terminologies (2)

data sharing: any way of sharing information; you ask me some data, I email you back with an attachment



data publishing: depositing data so that it becomes a citable artifact, discoverable



data archiving: thinking about data storage in the long-term, preserving your data



data terminologies (3)

data management: activities during a project to collect, annotate, and archive data

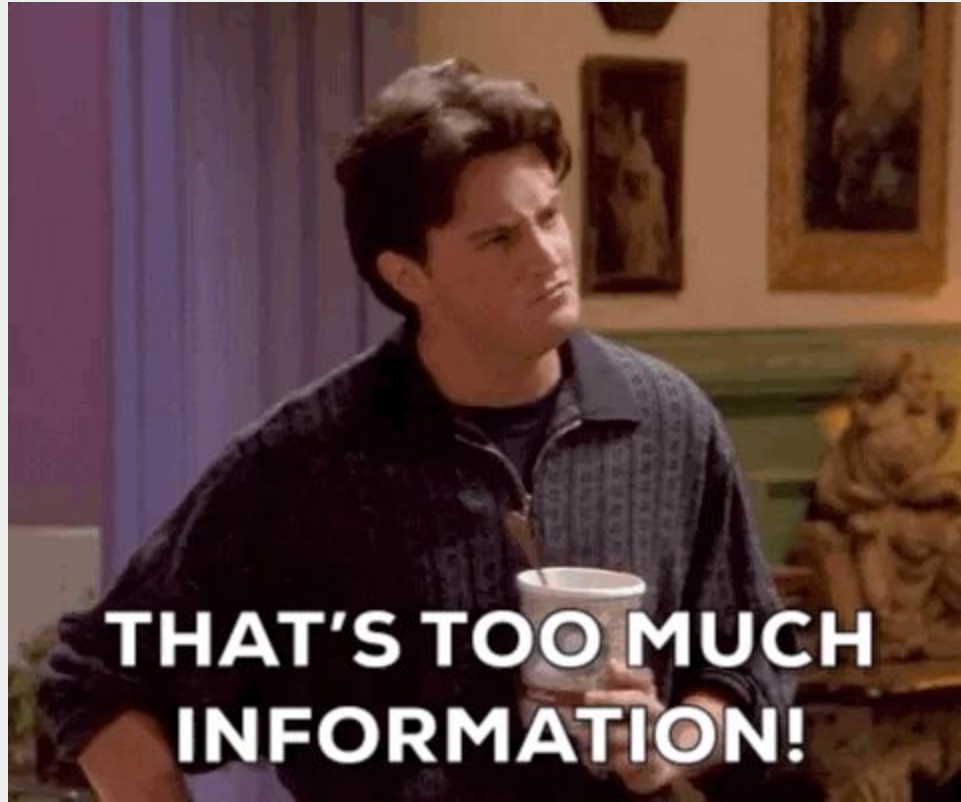


data stewardship: making data reusable for the long-term, also after the project has ended (data preservation)



data curation: creating, organizing and maintaining data sets, so that these can be accessed and used by people looking for information (part of the data management process)

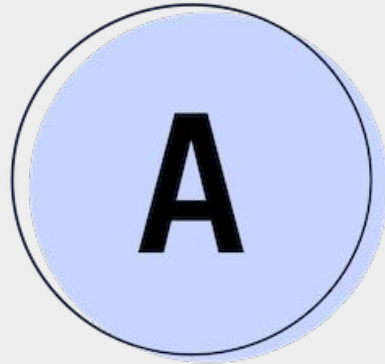




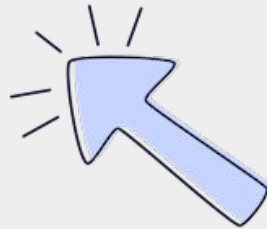
the FAIR principles as guidance for data stewardship



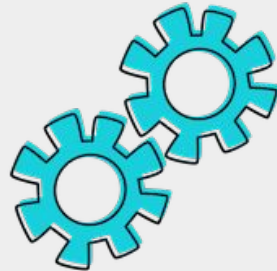
Findable



Accessible



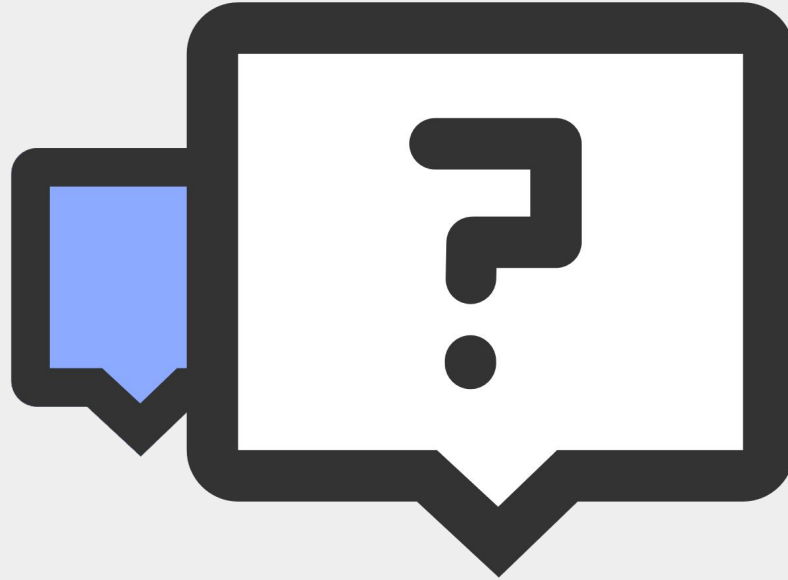
Interoperable



Reusable



TIME FOR QUESTIONS



the (rough) agenda

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the collaborative pad

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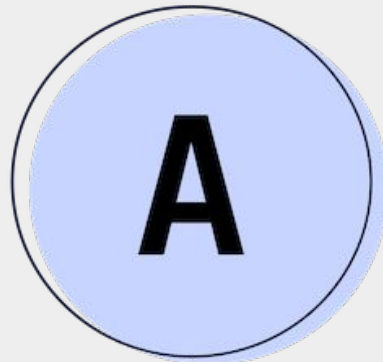
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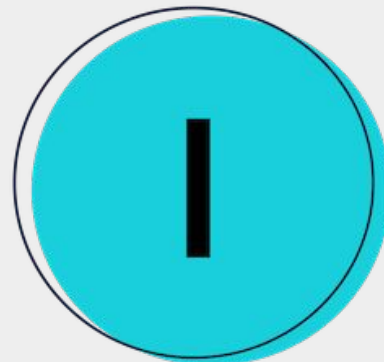
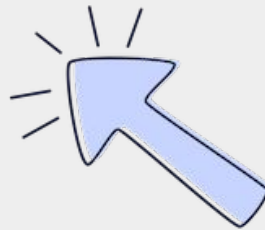
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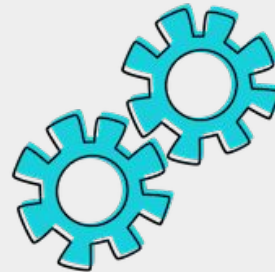
Findable



Accessible



Interoperable



Reusable



F is for Findable

data & metadata should be **easy to find** for both humans and computers

machine-readable metadata are essential for automatic discovery of datasets and services

sufficiently rich metadata & **unique and persistent identifiers** need to be used



Findable



have you ever landed on a 404 page?



**A W W W . . . D O N ' T
C R Y .**

It's just a 404 Error!

What you're looking for may have been misplaced in Long Term Memory.

persistent identifiers

A persistent identifier (PID) is a long-lasting reference to a digital resource and provides the information required to reliably identify, verify and locate your research data, eliminating many misunderstandings.

PIDs are sometimes described as a social security number for a research object. Another analogy which might be helpful when thinking about PIDs is with a statue, unique, long-lasting and robust.

persistent identifiers

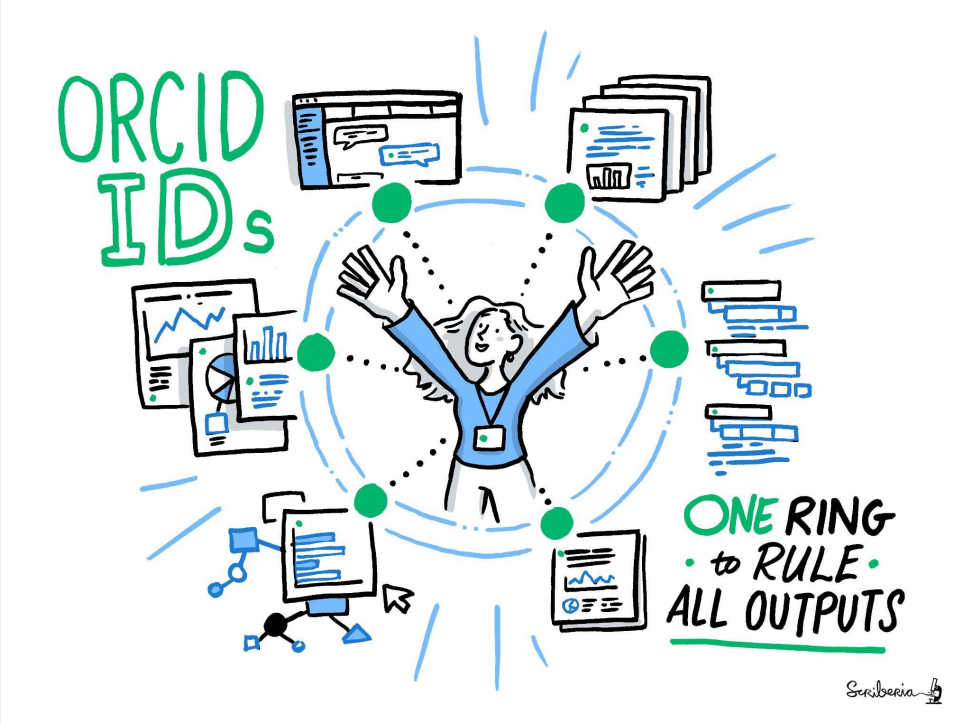
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Common PID are the Digital Object Identifier (DOI) and the Handle System, which can both be assigned to data to identify them uniquely.

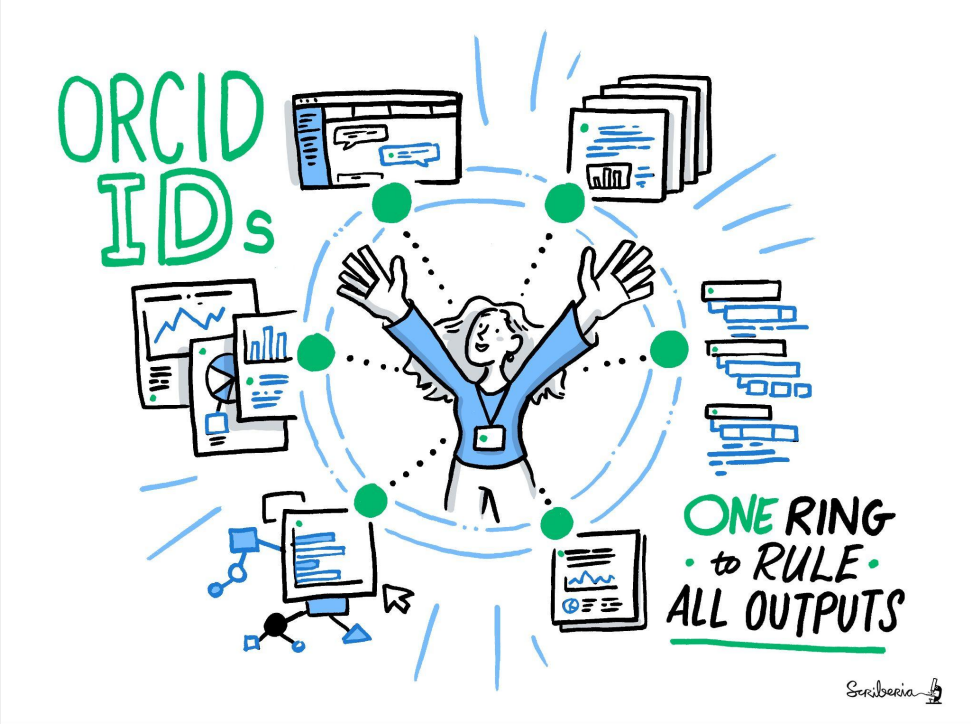
While DOIs are mainly assigned to resources ready for public dissemination, Handles are in general used to persistently identify other categories of digital resources (e.g. those created in the labs) to make them referable by software, workflows etc.

a PID for researchers



the Open Research
and Contributor ID

a PID for researchers



the Open Researcher and Contributor ID

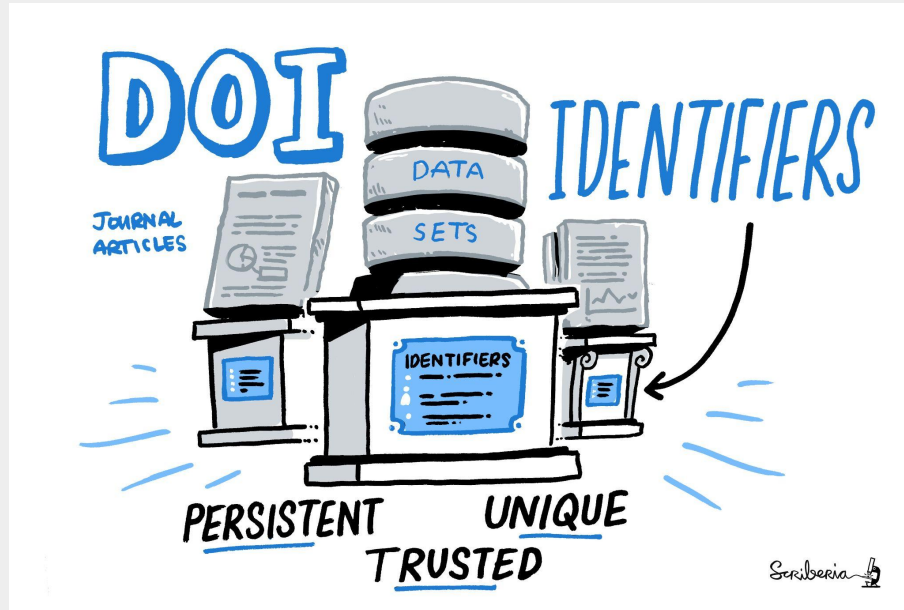
<https://orcid.org/0000-0003-3699-1195>

- do you have an ORCID?
- do you use it as part of your affiliation when submitting articles to journals?
- what do you think are the benefits of having an ORCID?



anatomy of a DOI

<https://doi.org/10.5281/zenodo.3679141>



resolver
service

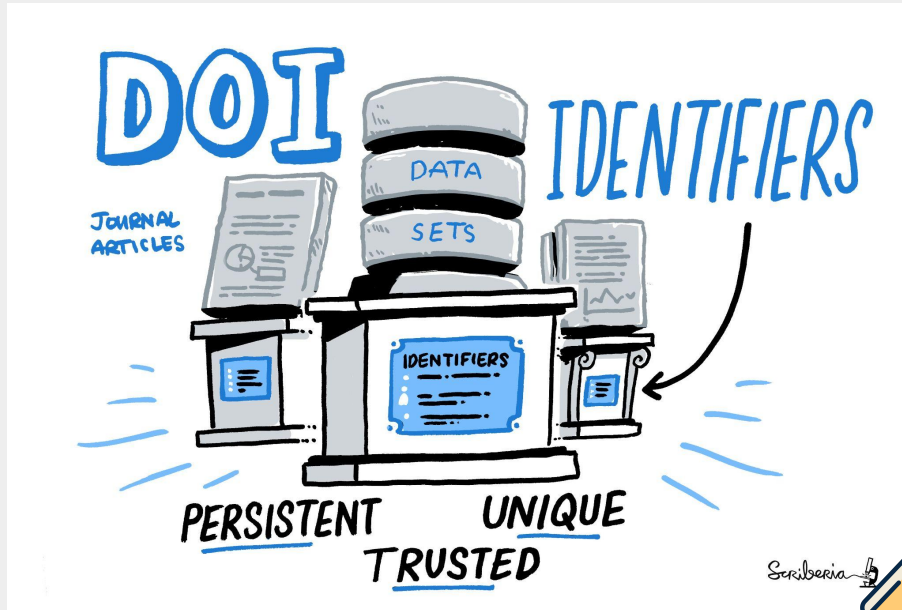


directory
indicator
+prefix
(assigning
body)

suffix
resource

anatomy of a DOI

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resolver
service



directory
indicator
+prefix
(assigning
body)

suffix
resource

- go to <https://www.doi.org/> and resolve some DOI's
- you can use some examples from <https://www.doi.org/demos.html> or use this one from me:
10.5281/zenodo.7260977

no PID? no FAIR

if your data and/or metadata are only stored internally at your institution or at another repository that does not issue a PID, they will not be FAIR



no PID? no FAIR

if your data and/or metadata are only stored internally at your institution or at another repository that does not issue a PID, they will not be FAIR



OK, so how do you
get a PID?

no PID? no FAIR

if your data and/or metadata are only stored internally at your institution or at another repository that does not issue a PID, they will not be FAIR



- deposit your data in a trusted repository that issues a PID
- institutional repository
 - domain specific repository
 - general-purpose repository

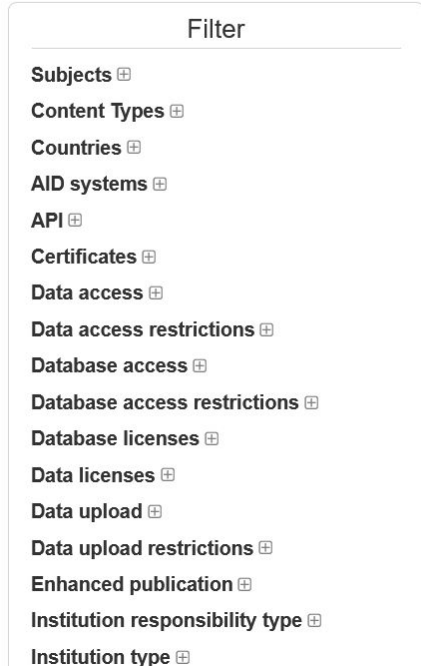
re3data.org
REGISTRY OF RESEARCH DATA REPOSITORIES

zenodo

OK, so how do you get a PID?

re3data listed repositories

re3data.org

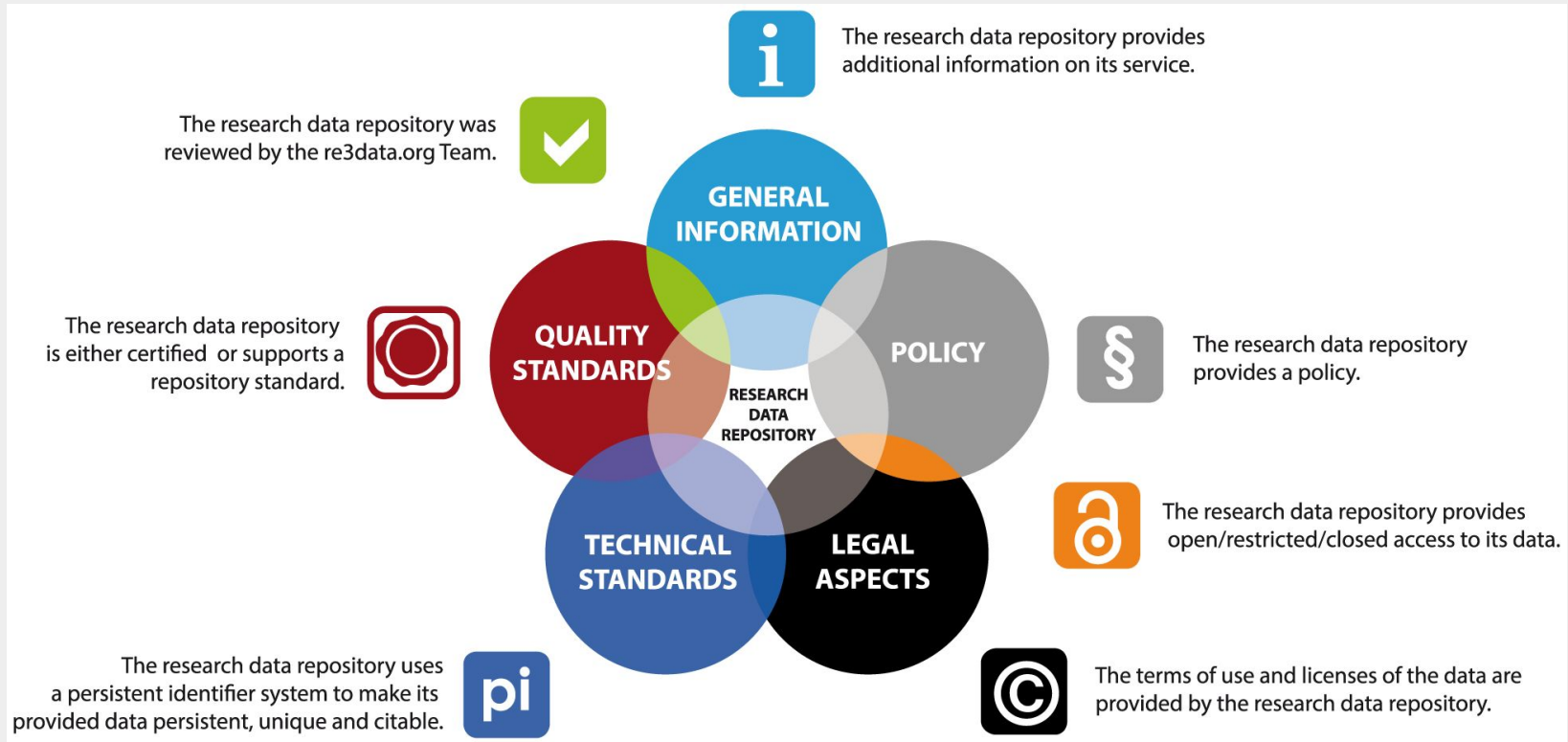


- go to <https://www.re3data.org/search> and look for a repository that could host the type of data for your research, or some data you are interested in
- check the **persistent identifier** and the **data access** field
- which other fields are there? something you want to know more about? let's discuss!



re3data.org
REGISTRY OF RESEARCH DATA REPOSITORIES

aspects of a research data repository



Zenodo: a general-purpose repository

The Zenodo logo is rendered in a bold, black, lowercase, rounded sans-serif typeface. The letters are thick and have a friendly, approachable feel. The 'z' and 'o's are particularly prominent due to their rounded shapes and weight.

Why use Zenodo?

- **Safe** – your research is stored safely for the future in CERN's Data Centre for as long as CERN exists.
- **Trusted** – built and operated by CERN and OpenAIRE to ensure that everyone can join in Open Science.
- **Citeable** – every upload is assigned a Digital Object Identifier (DOI), to make them citable and trackable.
- **No waiting time** – Uploads are made available online as soon as you hit publish, and your DOI is registered within seconds.
- **Open or closed** – Share e.g. anonymized clinical trial data with only medical professionals via our restricted access mode.
- **Versioning** – Easily update your dataset with our versioning feature.
- **GitHub integration** – Easily preserve your GitHub repository in Zenodo.
- **Usage statistics** – All uploads display standards compliant usage statistics

Zenodo: a general-purpose repository

zenodo

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- **Versioning** – Easily update your dataset with our versioning feature.
- **GitHub integration** – Easily preserve your GitHub repository in Zenodo.
- **Usage statistics** – All uploads display standards compliant usage statistics

- go to <https://sandbox.zenodo.org/> and either register or login
- we will practice on the **Zenodo sandbox** (and not on the “real” one)
- this is because once DOIs are created on the “real” service, they cannot be easily removed or modified (which makes sense!)
- on the sandbox service, data are deleted after a certain time

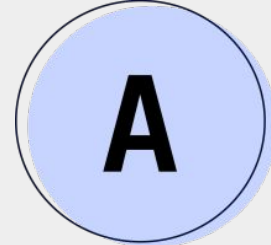


A is for accessible

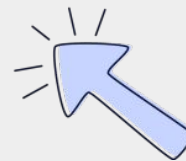
accessible does not imply
open

data & metadata need to be
retrievable by their identifier
using a standardized
communications protocol

research repositories often
use the OAI-PMH or REST API
protocols to interface with
data in the repository



Accessible

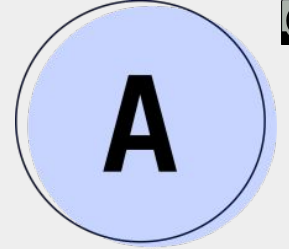


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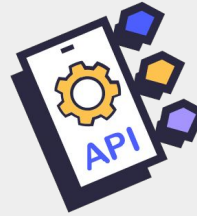
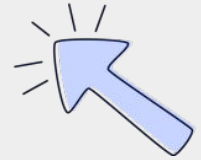
accessible does not imply open

data & metadata need to be retrievable by their identifier using a standardized communications protocol

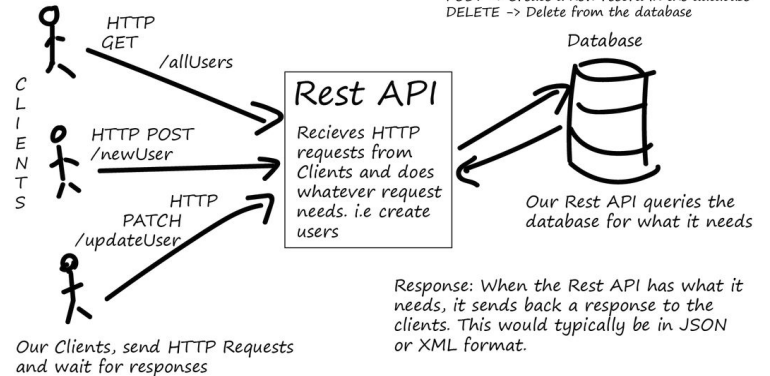
research repositories often use the OAI-PMH or REST API protocols to interface with data in the repository



Accessible



Rest API Basics



the case of OpenAlex



OpenAlex


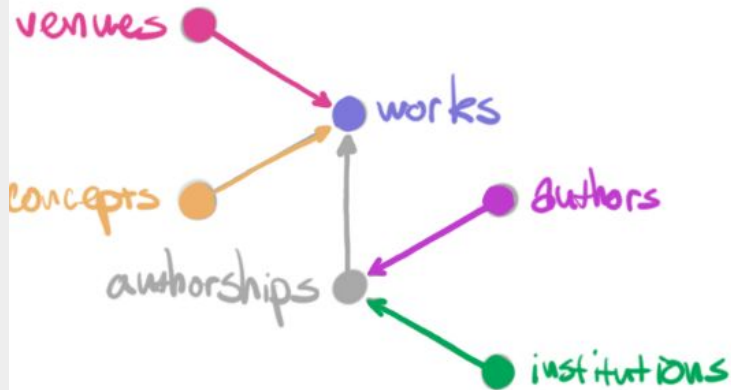
An open and comprehensive catalog of scholarly papers, authors, institutions, and more. 

Figure 1: Sketch of the OpenAlex graph data model.



the case of OpenAlex

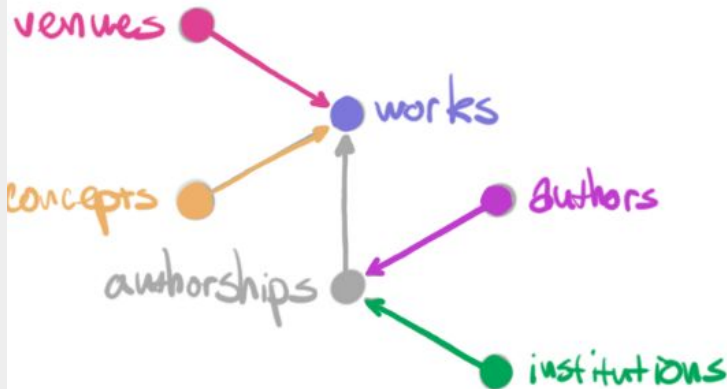


OpenAlex

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Figure 1: Sketch of the OpenAlex graph data model.



→ the API is the primary way to get **OpenAlex data**; it's free and requires no authentication



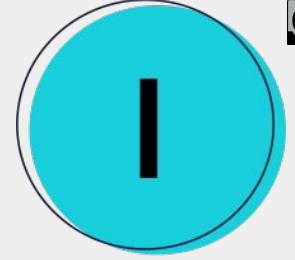
→ we will build some **API calls** and look at the returned outputs

- <https://api.openalex.org/authors/orcid:0000-0003-3699-1195>
- https://api.openalex.org/institutions?filter=display_name.search:university%20of%20maribor
- <https://api.openalex.org/institutions/137696226>
- https://api.openalex.org/works?filter=institutions.id:https://api.openalex.org/institutions/137696226,is_paratext:false,type:journal-article,from_publication_date:2020-01-01

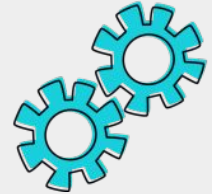
I is for Interoperable

data & metadata need to be interoperable: it needs to be possible to **combine them with other data & tools**

this means that their format needs to be open, and that both data & metadata use a formal, accessible, shared, and broadly applicable **language for knowledge representation** (controlled vocabularies and ontologies, wherever possible)



Interoperable




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not machine-readable



machine-readable, but closed, not standard format



machine-readable in a format that is both open and standard



Interoperable



human-readable

human-readable

data that can be read, processed, by people, human beings

we can easily read a PDF document, but an algorithm/a machine can't because the representation of the data on disk does not reflect the relationship of the data in reality



human-readable vs machine-readable

human-readable

data that can be read, processed, by people, human beings

we can easily read a PDF document, but an algorithm/a machine can't because the representation of the data on disk does not reflect the relationship of the data in reality

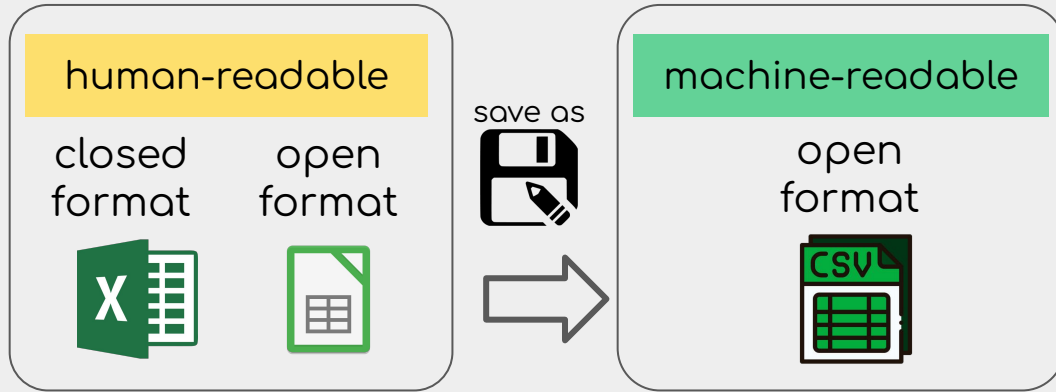
machine-readable

data in a format that can be automatically read and processed by a computer, such as CSV, RDF, JSON, XML, etc.

machine-readable data must be *structured data*

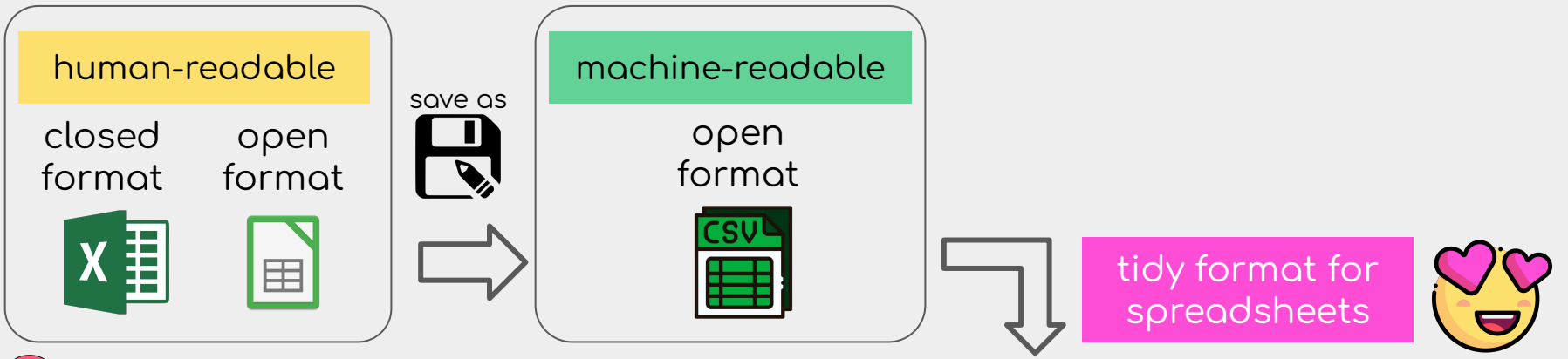


data organized in spreadsheets



? Ask yourself: can anybody open this file and look at the data? Do people need to buy specific software to do so?

data organized in spreadsheets



? Ask yourself: can anybody open this file and look at the data? Do people need to buy specific software to do so?

country	year	cases	population
Afghanistan	1999	1815	197071
Afghanistan	2000	1866	2095360
Brazil	1999	31737	17206362
Brazil	2000	81488	17404898
China	1999	211258	127215272
China	2000	212766	12813583

variables

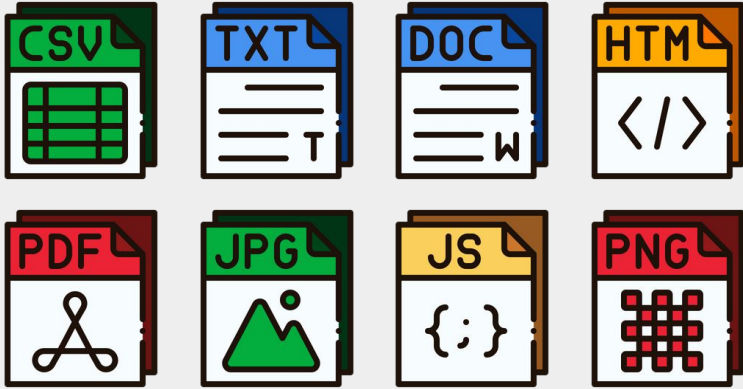
country	year	cases	population
Afghanistan	1999	1815	197071
Afghanistan	2000	1866	2095360
Brazil	1999	31737	17206362
Brazil	2000	81488	17404898
China	1999	211258	127215272
China	2000	212766	12813583

observations

country	year	cases	population
Afghanistan	1999	1815	197071
Afghanistan	2000	1866	2095360
Brazil	1999	31737	17206362
Brazil	2000	81488	17404898
China	1999	211258	127215272
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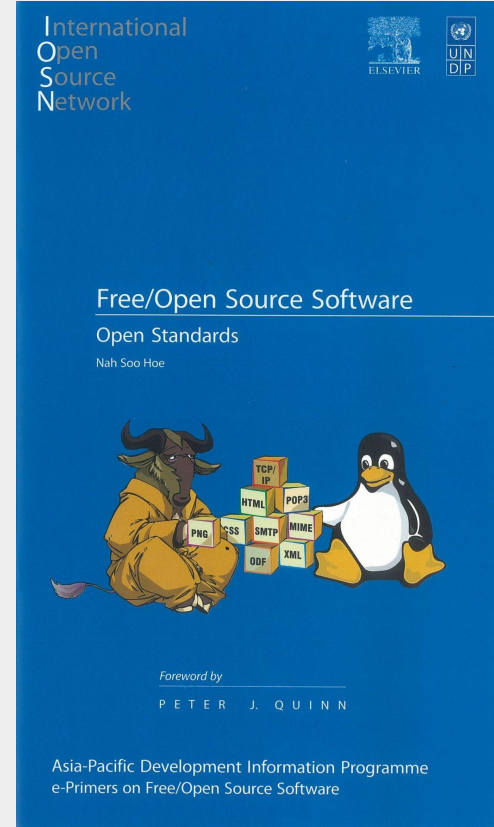
values

open file formats



→ go to https://en.wikipedia.org/wiki/List_of_open_file_formats:
is there a format you don't know?

→ browse the wikibook https://en.wikibooks.org/wiki/FOSS_Open_Standards/Comparison_of_File_Formats and take a look at the Office Document Formats; **is PDF an open format?**



controlled vocabularies for FAIR metadata

a controlled vocabulary
reflects **agreement on
terminology** used to label
concepts

when research
communities agree to use
common language for the
concepts in datasets, then
the discovery, linking,
understanding and reuse
of research (data) are
improved

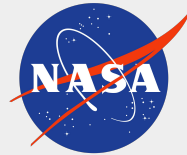
controlled vocabularies for FAIR metadata

a controlled vocabulary reflects **agreement on terminology** used to label concepts



TITLE	UNESCO Thesaurus
DESCRIPTION	The UNESCO Thesaurus is a controlled and structured list of terms used in subject analysis and retrieval of documents and publications in the fields of education, culture, natural sciences, social and human sciences, communication and information. Continuously enriched and updated, its multidisciplinary terminology reflects the evolution of UNESCO's programmes and activities.
IDENTIFIER	http://vocabularies.unesco.org/thesaurus

when research communities agree to use **common language** for the concepts in datasets, then the discovery, linking, understanding and reuse of research (data) are improved



NASA Thesaurus

[Cite the NASA Thesaurus](#) | [Access the NASA Thesaurus](#)

The NASA Thesaurus contains the authorized NASA subject terms used to index and retrieve materials in the [STI Repository](#). The scope of this controlled vocabulary includes not only aerospace engineering, but all supporting areas of engineering and physics, the natural space sciences (astronomy, astrophysics, and planetary science), Earth sciences, and the biological sciences. The NASA Thesaurus contains over 18,400 subject terms, 4,300 definitions, and more than 4,500 USE cross references.



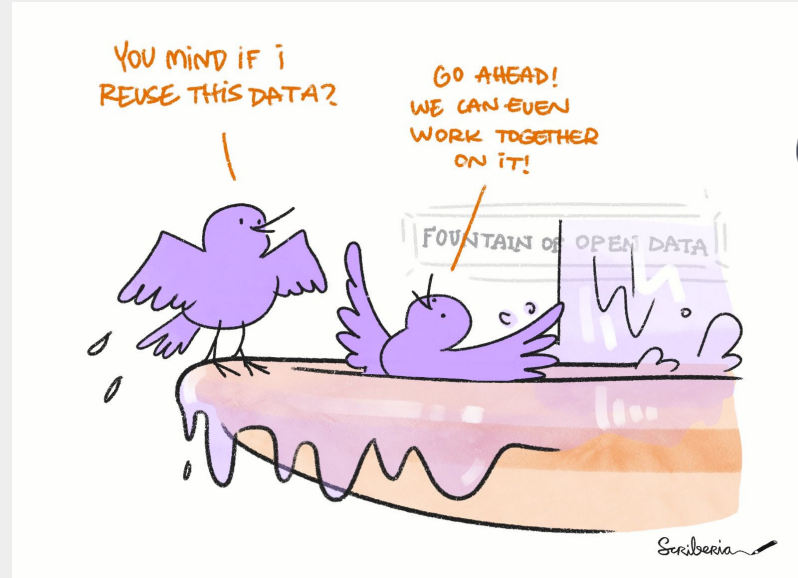
R is for Reusable



Reusable

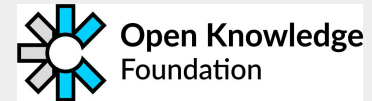
data & metadata need to be well-described so that they can be **replicated** and/or **combined** in different settings

data & metadata need to be accompanied by **clear**, **open**, **understandable** licenses



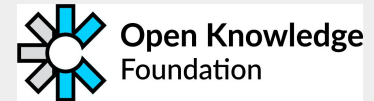
licenses conformant to the open data definition

License (SPDX IDs)	Domain	By	SA	Comments
Creative Commons CCZero (CC0-1.0)	Content, Data	N	N	Dedicate to the Public Domain (all rights waived)
Open Data Commons Public Domain Dedication and Licence (PDDL-1.0)	Data	N	N	Dedicate to the Public Domain (all rights waived)
Creative Commons Attribution 4.0 (CC-BY-4.0)	Content, Data	Y	N	
Open Data Commons Attribution License (ODC-By-1.0)	Data	Y	N	Attribution for data(bases)
Creative Commons Attribution Share-Alike 4.0 (CC-BY-SA-4.0)	Content, Data	Y	Y	
Open Data Commons Open Database License (ODbL-1.0)	Data	Y	Y	Attribution-ShareAlike for data(bases)



licenses conformant to the open data definition

<u>License (SPDX IDs)</u>	Domain	By	SA	Comments
<u>Creative Commons CCZero (CC0-1.0)</u>	Content, Data	N	N	Dedicate to the Public Domain (all rights waived)
<u>Open Data Commons Public Domain Dedication and Licence (PDDL-1.0)</u>	Data	N	N	Dedicate to the Public Domain (all rights waived)
<u>Creative Commons Attribution 4.0 (CC-BY-4.0)</u>	Content, Data	Y	N	Creator must be credited
<u>Open Data Commons Attribution License (ODC-By-1.0)</u>	Data	Y	N	Attribution for data(bases)
<u>Creative Commons Attribution Share-Alike 4.0 (CC-BY-SA-4.0)</u>	Content, Data	Y	Y	Derivatives or redistributions must have identical license
<u>Open Data Commons Open Database License (ODbL-1.0)</u>	Data	Y	Y	Attribution-ShareAlike for data(bases)



creative commons licenses



	<u>Derivatives</u> Can Be Shared	<u>Derivatives</u> Can Be Shared ONLY IF You Share Alike	<u>Derivatives</u> CANNOT Be Shared
<u>Commercial Use</u> Allowed			
<u>Commercial Use</u> NOT Allowed			

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	<u>Derivatives</u> Can Be Shared	<u>Derivatives</u> Can Be Shared ONLY IF You Share Alike	<u>Derivatives</u> CANNOT Be Shared
<u>Commercial Use</u> Allowed			
<u>Commercial Use</u> NOT Allowed			

No Derivative Works

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Non-Commercial

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choosing a license

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Follow the steps to select the appropriate license for your work. This site does not store any information.



- go to the beta license chooser from Creative Commons: <https://chooser-beta.creativecommons.org/> and walk through the steps to choose an appropriate license for your work
- software needs specific licenses: go to <https://choosealicense.com/> and take a look at what options are available; select the MIT license and see what it entails
- general tip: avoid writing bespoke licenses!

Choose an open source license

FAIR4RS

Article | [Open Access](#) | [Published: 14 October 2022](#)

Introducing the FAIR Principles for research software

[Michelle Barker](#) , [Neil P. Chue Hong](#), [Daniel S. Katz](#), [Anna-Lena Lamprecht](#), [Carlos Martinez-Ortiz](#), [Fotis Psomopoulos](#), [Jennifer Harrow](#), [Leyla Jael Castro](#), [Morane Gruenpeter](#), [Paula Andrea Martinez](#) & [Tom Honeyman](#)

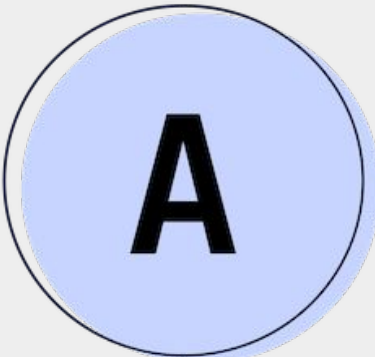
[Scientific Data](#) **9**, Article number: 622 (2022) | [Cite this article](#)

14k Accesses | **18** Citations | **240** Altmetric | [Metrics](#)

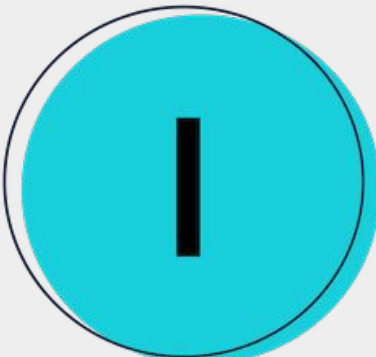
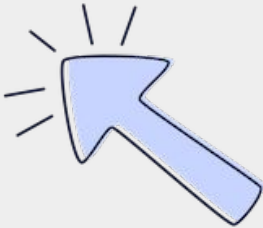
a short recap on FAIR



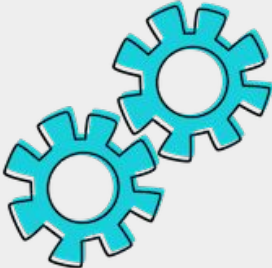
Findable



Accessible



Interoperable



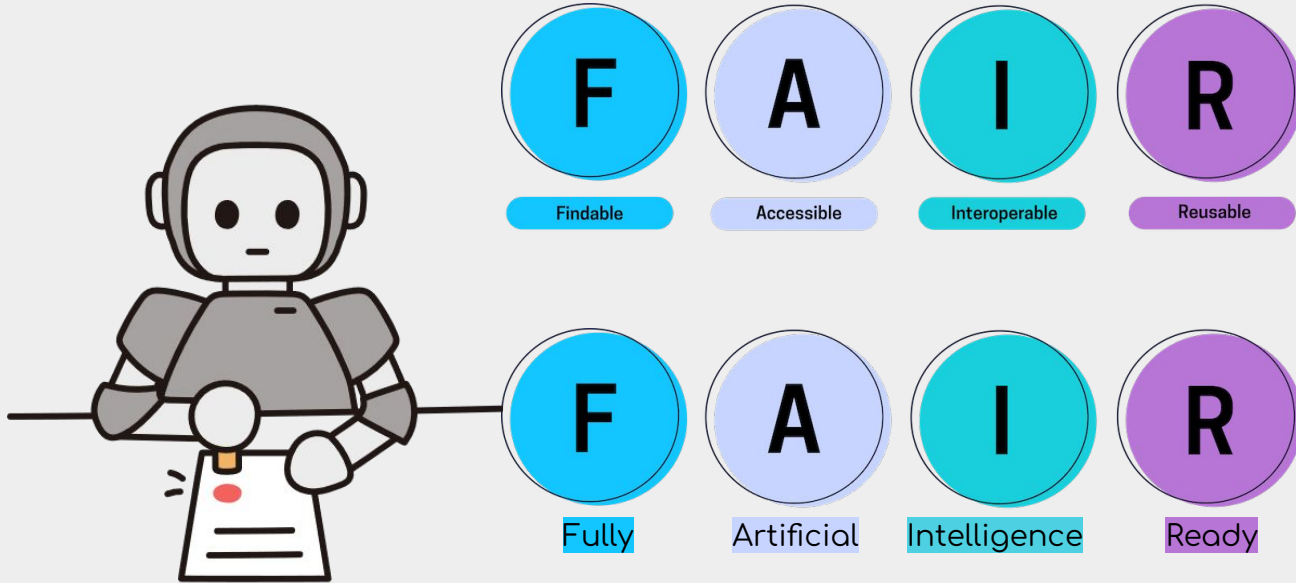
Reusable



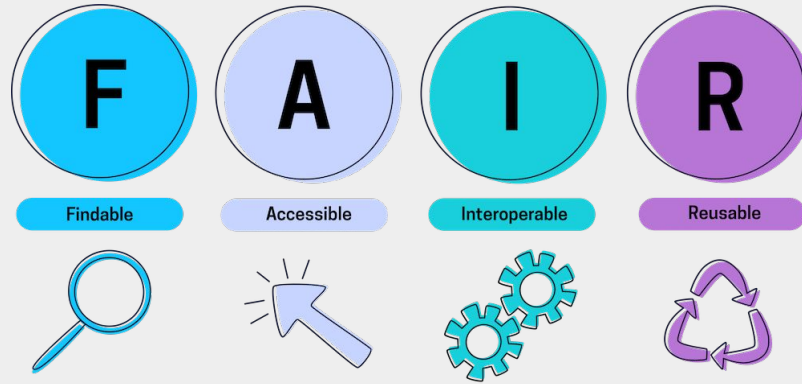
FAIR for people and for machines



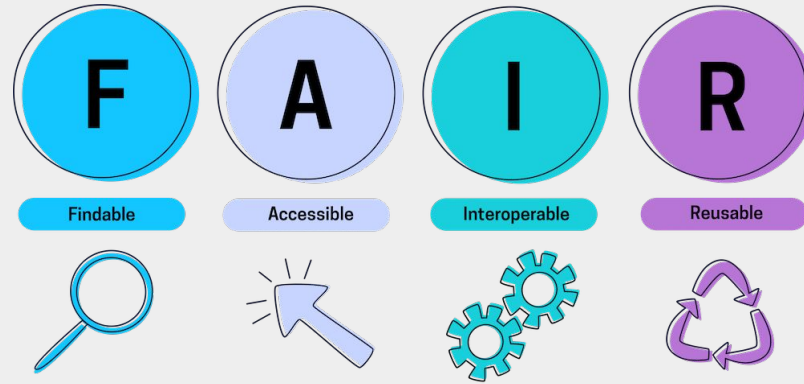
FAIR for people and for machines



FAIR is absolutely great



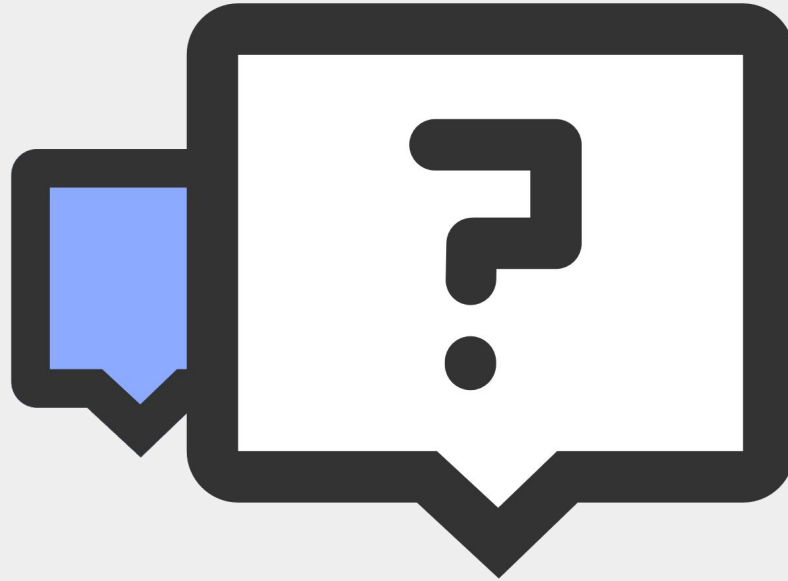
FAIR with a pinch of love is even better



from FAIR to CARE



TIME FOR QUESTIONS



the (rough) agenda

Introduction to research data and FAIR - 12h15-12:45

The FAIR principles in action - 13h00-14h00

F for Findable

A for Accessible

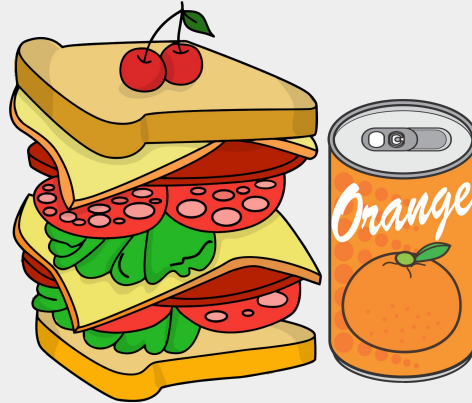
I for Interoperable

R for Reusable

Lunch 14h00-15h00

FAIRify (your) data - 15h00-16h15

TIME FOR LUNCH!



the (rough) agenda

Introduction to research data and FAIR - 12h15-12:45

The FAIR principles in action - 13h00-14h00

F for Findable

A for Accessible

I for Interoperable

R for Reusable

Lunch 14h00-15h00

FAIRify (your) data - 15h00-16h15



BEFORE WE START...
CAN WE DISCUSS THE
DATASETS YOU SHARED WITH
ME OPENLY IN THE CLASS?

useful links

<http://tiny.cc/maribor>



<http://tiny.cc/maribordata>



tabular data



tabular data: messy or tidy?

Data is often acquired and represented in various shapes and sizes, but it is most commonly received in the form of data tables (tabular data).

A dataset is messy or tidy depending on how **rows**, **columns** and **tables** are matched up with **observations**, **variables** and **types**.

tabular data: messy or tidy?

Data is often acquired and represented in various shapes and sizes, but it is most commonly received in the form of data tables (tabular data).

A dataset is messy or tidy depending on how **rows**, **columns** and **tables** are matched up with **observations**, **variables** and **types**.

“**TIDY DATA** is a standard way of mapping the meaning of a dataset to its **structure**.”

—HADLEY WICKHAM

In tidy data:

- each **variable** forms a **column**
- each **observation** forms a **row**
- each **cell** is a **single measurement**

each column a variable

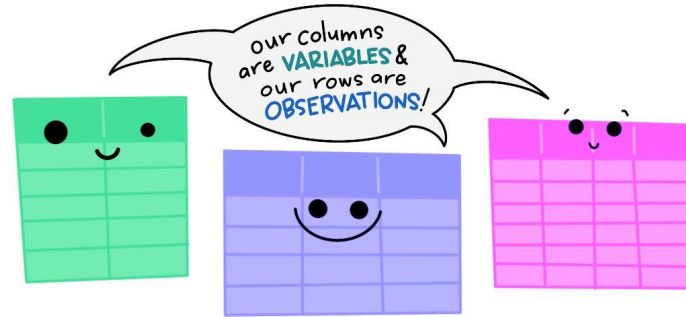
id	name	color
1	floof	gray
2	max	black
3	cat	orange
4	donut	gray
5	merlin	black
6	panda	calico

each row an observation

Wickham, H. (2014). Tidy Data. Journal of Statistical Software 59 (10). DOI: 10.18637/jss.v059.i10

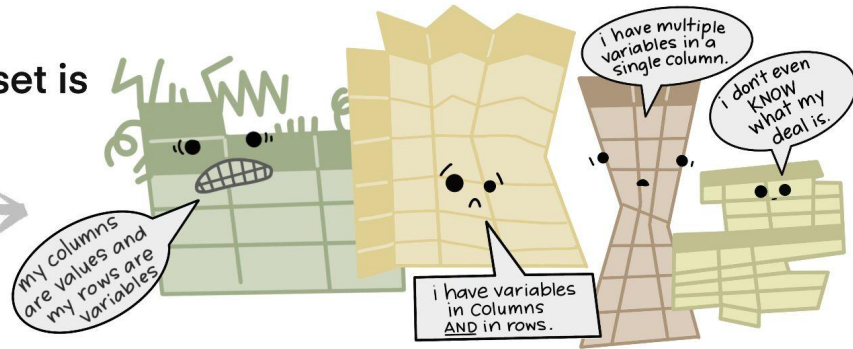
tidy datasets are all alike (and happy!)

The standard structure of tidy data means that "tidy datasets are all alike..."



"...but every messy dataset is messy in its own way."

—HADLEY WICKHAM

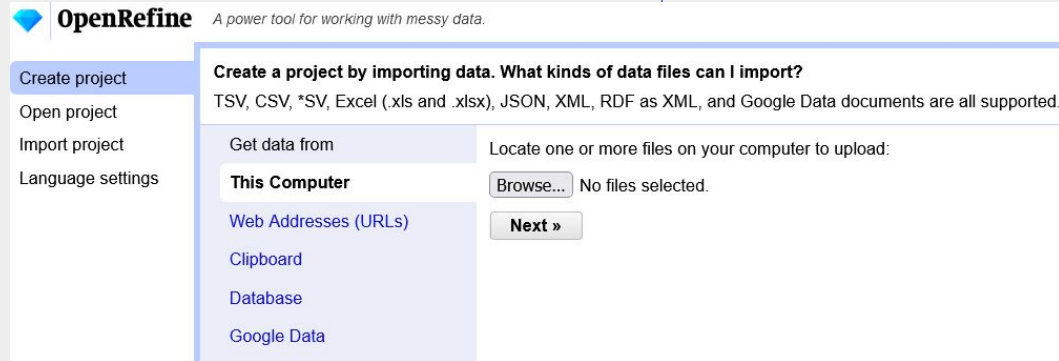


what we need: some (toy) data and a tool

<http://tiny.cc/maribordata>



OpenRefine



let's tidy up some data

- open the `untidy1.csv` file: why is this data not tidy?
- let's tidy it up in `OpenRefine`: launch the software (this opens <http://127.0.0.1:3333> in your default browser), import the file, and create a Project (you can leave the default name)
- select the Boeing Stock Price and follow the steps highlighted below
- what has happened to the data?



OpenRefine

Boeing Stock Price	Amazon Stock Price	Google Stock Price
Facet ▶	\$174.90	\$174.34
Text filter	\$171.42	\$170.04
Edit cells ▶		
Edit column ▶		
Transpose ▶	Transpose cells across columns into rows...	
Sort...	Transpose cells in rows into columns...	
View ▶	Columnize by key/value columns...	
Reconcile ▶		

Transpose into

- Two new columns
 - Key Column (containing original columns' names)
 - Value Column (containing original cells' values)
- One column
- prepend the original column's name to each cell followed by before the cell's value
- Ignore blank cells
- Fill down in other columns



let's tidy up some data



OpenRefine

- remember, in a tidy format, each variable should be its own column
- while this is not the case in 1, it is the case in 2 (see images below)
- the last thing to do is to change the stock names: to do this, follow the steps highlighted in 3



1

All	Date	Boeing Stock Price	Amazon Stock Price	Google Stock Price
1.	2009-01-01	\$173.55	\$174.90	\$174.34
2.	2009-01-02	\$172.61	\$171.42	\$170.04

Text transform on 6 cells in column Stock Name: `value.replace(" Stock Price", "")`

2

All	Date	Stock Name	Stock Price
1.	2009-01-01	Boeing Stock Price	\$173.55
2.	2009-01-01	Amazon Stock Price	\$174.90
3.	2009-01-01	Google Stock Price	\$174.34
4.	2009-01-02	Boeing Stock Price	\$172.61
5.	2009-01-02	Amazon Stock Price	\$171.42
6.	2009-01-02	Google Stock Price	\$170.04

3

Stock Name	Stock Price
Facet	73.55
Text filter	74.90
Text filter	74.34
Edit cells	Transform...
Edit column	Common transforms
Transpose	Fill down
Sort...	Blank down
View	Split multi-valued cells...
Reconcile	Join multi-valued cells...
	Cluster and edit...
	Replace...

our first tidy dataset

this was a very small dataset (just two rows), and we could have also cleaned it up manually

for larger datasets, however, this would become very inefficient and laborious, so tools like **OpenRefine**, or R libraries like **tidyR**, become very powerful

Date	Boeing Stock Price	Amazon Stock Price	Google Stock Price
2009-01-01	\$173.55	\$174.90	\$174.34
2009-01-02	\$172.61	\$171.42	\$170.04



this untidy format is also known as **wide format**

Date	Stock Name	Stock Price
2009-01-01	Boeing	\$173.55
2009-01-01	Amazon	\$174.90
2009-01-01	Google	\$174.34
2009-01-02	Boeing	\$172.61
2009-01-02	Amazon	\$171.42
2009-01-02	Google	\$170.04



this tidy format is also known as **long format**

a more complex case

- open now the `untidy2.csv` file: why is this dataset not tidy?
- the variables have two different units of observation: household and household member; as a result, we have multiple columns for a single variable (look at the age and gender columns)
- the trick here is to create two tables, one for each unit of observation
- open the file in OpenRefine, and perform a transpose operation like explained below



	All	hhid	bicycle	fridge	hhszise	gender_1	age_1	gender_2	age_2	gender_3	age_3
☆	1.	1001	1	0	3	1	55	2	5	1	48
☆	2.	1374	0	0	2	1	23	1	9		
☆	3.	1077	0	0	1	2	5				

Transpose cells in columns starting with `gender_1` into rows in two new columns named `Variable` and `Value`

household 1077 only has one member, so the columns for `gender_2`, `age_2`, `gender_3`, and `age_3` are empty (missing values)

a more complex case

→ after the transpose, edit the Variable column with the expression below

hhid	bicycle	fridge	hnsz	Variable	Value
1001	1	0	3	gender_1	1
1001	1	0	3	age_1	55
1001	1	0	3	gender_2	2
1001	1	0	3	age_2	5
1001	1	0	3	gender_3	1
1001	1	0	3	age_3	48
1374	0	0	2	gender_1	1
1374	0	0	2	age_1	23
1374	0	0	2	gender_2	1
1374	0	0	2	age_2	9
1077	0	0	1	gender_1	2
1077	0	0	1	age_1	5

Transpose cells in columns starting with gender_1 into rows in two new columns named Variable and Value

Custom text transform on column Variable

Expression

`value.split("_")[0]`

Language

General Refine Expression Language (GREL)

No syntax error.

Preview [History](#) [Starred](#) [Help](#)

row	value	value.split("_")[0]
1.	gender_1	gender
2.	age_1	age
3.	gender_2	gender
4.	age_2	age
5.	gender_3	gender
6.	age_3	age



a more complex case



hhid	bicycle	fridge	hhsz	Variable	Value
1001	1	0	3	gender	1
1001	1	0	3	age	55
1001	1	0	3	gender	2
1001	1	0	3	age	5
1001	1	0	3	gender	1
1001	1	0	3	age	48
1374	0	0	2	gender	1
1374	0	0	2	age	23
1374	0	0	2	gender	1
1374	0	0	2	age	9
1077	0	0	1	gender	2
1077	0	0	1	age	5



hhid	bicycle	fridge	hhsz	gender	age
1001	1	0	3	1	55
1001	1	0	3	2	5
1001	1	0	3	1	48
1374	0	0	2	1	23
1374	0	0	2	1	9
1077	0	0	1	2	5



- next step would be to transpose again so that the variable column becomes two separate columns, gender and age
- finally, identifiers for the household members need to be created
- **it is key to have identifiers on both side!**

from a nested dataset to multiple datasets

hhid	bicycle	fridge	hhsz	gender_1	age_1	gender_2	age_2	gender_3	age_3
1001	1	0	3	1	55	2	5	1	48
1374	0	0	2	1	23	1	9		
1077	0	0	1	2	5				



nested structure!

hhid	bicycle	fridge	hhsz
1001	1	0	3
1374	0	0	2
1077	0	0	1

hhid	hnm	gender	age
1001	1	1	55
1001	2	2	5
1001	3	1	48
1374	1	1	23
1374	2	1	9
1077	1	2	5



one table for each unit of observation

the open data portal of Slovenia



Dobrodošli na portalu Odprti podatki Slovenije!

Na portalu OPSI boste našli vse od podatkov, orodij, do koristnih virov, s katerimi boste lahko razvijali spletne in mobilne aplikacije, oblikovali lastne infografike in drugo.

VIDEO O PORTALU OPSI

VIDEO - ODPRTI PODATKI

PODROČJA



our world in data

Research and data to make progress against
the world's largest problems

3653 charts across 297 topics
All free: open access and open source



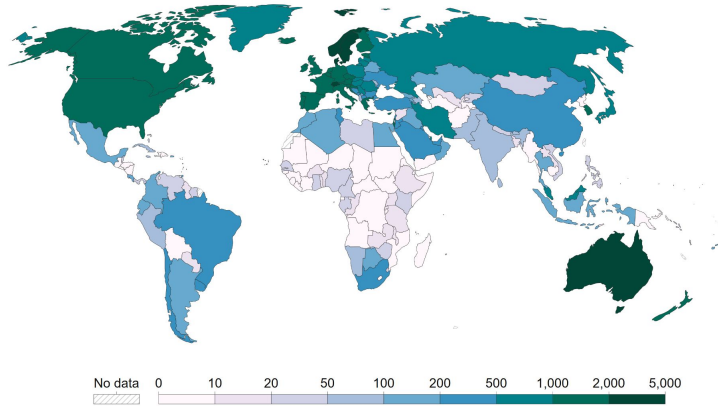
Our World
in Data



Annual articles published in scientific and technical journals per million
people, 2018

Includes physics, biology, chemistry, mathematics, clinical medicine, biomedical research, engineering and technology, and earth and space sciences.

Our World
in Data



Source: World Bank (2022); United Nations (2022)
Note: Articles are counted by the country of the author's institution.

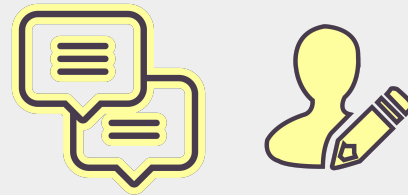
OurWorldInData.org/research-and-development • CC BY

- we will now work with the `scientific-publications-per-million.csv` file
- this data contains “scientific and technical journal articles per million people” from 2000 to 2018
- the data can be downloaded from `Our world in data`, but I have already put it in our data directory
- we will `annotate` this dataset and `publish` it on the web

<http://tiny.cc/maribordata>



let's discuss the datasets together: we can use the collaborative pad to write down some questions and answers, or any thoughts!



Frictionless data



Data software and standards

Frictionless is an open-source toolkit that brings simplicity to the data experience - whether you're wrangling a CSV or engineering complex pipelines.

Frictionless data & data packages



Data software and standards

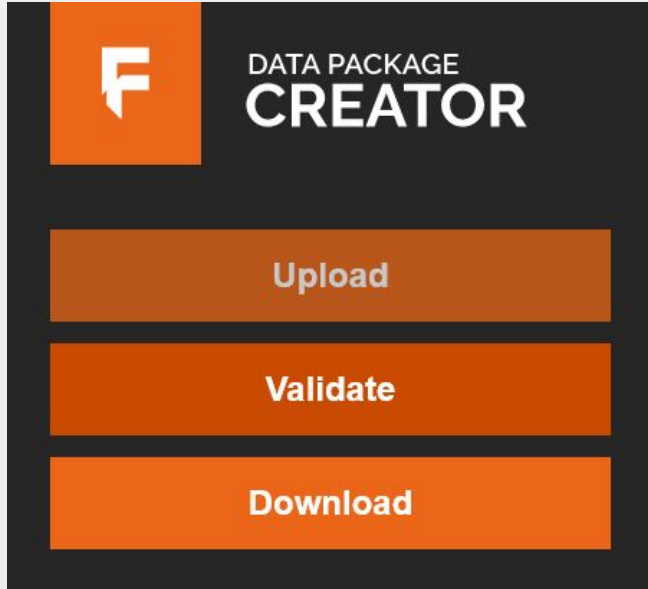
Frictionless is an open-source toolkit that brings simplicity to the data experience - whether you're wrangling a CSV or engineering complex pipelines.



Data Package is a **format** that makes it possible to put data and relevant information that provides **context** about it, in one container before you share it

all contextual information, like the **metadata** and the **data schema**, is published in a JSON file named ***datapackage.json***

the data package creator



- we'll use the **Data Package Creator**, an online service that facilitates the creation and editing of data packages
- go to: <https://create.frictionlessdata.io/>
- there are several ways to create a data package - if your data resource is publicly available, like on GitHub/Gitlab or in a data repository, you can obtain the URL and paste it in the Path section
- we will **load a resource from our CSV file**



Resources

Name	resource	Path	Type resource path	Load	🗑️	⚙️	▼
	resource		Type resource path				
	resource		scientific-publications-per-million.csv				

annotate the data



Add all inferred fields
(data has 4 extra column(s))

Code 🗑️

1	AFG
---	-----

Title
ISO 3166-1 alpha-3

Description
Three-letter country codes

Data Type
string ▼

Data Format
default ▼

Year 🗑️

1	2000
---	------

Title

Description

Data Type
integer ▼

Data Format
default ▼

- the tool is relatively smart, so it will automatically **infer the fields** of your data
- however, it is still up to you to add **Title** and **Description** to the columns, and to make sure that the **Data Types** are inferred correctly
- check the data type of the column **Year**: is it correct?

take care of the metadata

- add **metadata** to the dataset
name, title, description, author, license
- because this is data already published somewhere else, we need to make sure we respect the original **terms and conditions**



Reuse this work freely

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- we are then finally ready to **validate** and **download** the data package!
- the package is a *json* file which you can then open in any text editor, or, even better, in your web browser

Validate

Download

Metadata

Name

scientific-papers-data-package

Title

Scientific papers data package

Profile

Tabular Data Package

Description

Scientific and technical journal articles per million people

Home Page

indata.org/research-and-development

Version

1.0.0

Author

Paola Masuzzo

License

Name

CC-BY-4.0


Title

Creative Commons Attribution 4.0

Path

<https://creativecommons.org/licenses/>

the data package



```

JSON  Raw Data  Headers
Save Copy Collapse All Expand All Filter JSON
profile: "tabular-data-package"
resources: [...]
  name: "scientific-papers-data-package"
  title: "Scientific papers data package"
description: "Scientific and technical...les per million people "
homepage: "https://ourworldindata.o...research-and-development"
contributors: [...]
licenses: [...]
  
```

```

profile: "tabular-data-package"
resources:
  0:
    name: "resource1"
    path: "scientific-publications-per-million.csv"
    profile: "tabular-data-resource"
  schema:
    fields:
      0: {...}
      1: {...}
      2: {...}
      3: {...}
    name: "scientific-papers-data-package"
    title: "Scientific papers data package"
description: "Scientific and technical...les per million people "
homepage: "https://ourworldindata.o...research-and-development"
contributors: [...]
licenses: [...]
  
```

```

schema:
  fields:
    0:
      name: "Entity"
      type: "string"
      format: "default"
      title: "Country"
      description: "This is the country of the datas"
    1:
      name: "Code"
      type: "string"
      format: "default"
      description: "Three-letter country codes"
      title: "ISO 3166-1 alpha-3"
    2:
      name: "Year"
      type: "year"
      format: "default"
      title: "Year"
      description: "The year of the measurement"
    3:
      (...)
  
```

- the data package contains **1 resource** (the CSV file with our data), and this resource has a well-defined **schema with 4 fields**
- when we will publish this dataset on the web, we will publish both the data (the CSV) file, and this *json* file, which acts as a **data dictionary**
- this will help other people understand the data, will aid machine readability, and overall make reuse and repurpose of the data much easier

publish the data package

New upload

Instructions: (i) Upload minimum one file and fill-in required fields (marked with a red star). (ii) Press "Save" to save your upload for editing later. (iii) When ready, press "Publish" to finalize and make your upload public.

Files ▼ Choose files Start upload

Filename (2 files)	Size	Progress	Delete
datapackage.json	2 kB		
scientific-publications-per-million.csv	106 kB		

Note: File addition, removal or modification are not allowed after you have published your upload. This is because a Digital Object Identifier (DOI) is registered with [DataCite](#) for each upload.
(minimum 1 file required, max 50 GB per dataset - [contact us](#) for larger datasets)
If you're experiencing issues with uploading larger files, read our [FAQ section](#) on file upload issues.

Communities 🔔 recommended ➤

Upload type required ▼

- Publication
- Poster
- Presentation
- Dataset**
- Image
- Video/Audio
- Software
- Lesson
- Physical object
- Workflow
- Other

Basic information required ▼

Digital Object Identifier

Optional. Did your publisher already assign a DOI to your upload? If not, leave the field empty and we will register a new DOI for you. A DOI allows others to easily and unambiguously cite your upload. Please note that it is NOT possible to edit a Zenodo DOI once it has been registered by us, while it is always possible to edit a custom DOI.

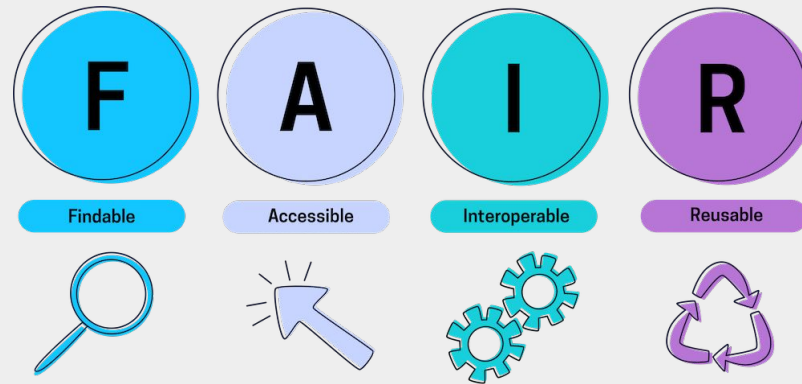
Reserve DOI ✔

- let's **publish the dataset** on the web
- go to <https://sandbox.zenodo.org/> and sign-in
- choose both files and start the **upload**
- select **Dataset** as upload type, and don't forget to **reserve a DOI!**
- go ahead and fill in the other required fields
- save your upload, ad finally publish it!

CONGRATULATIONS!



a FAIR dataset



a FAIR dataset

Publication date:

September 1, 2023

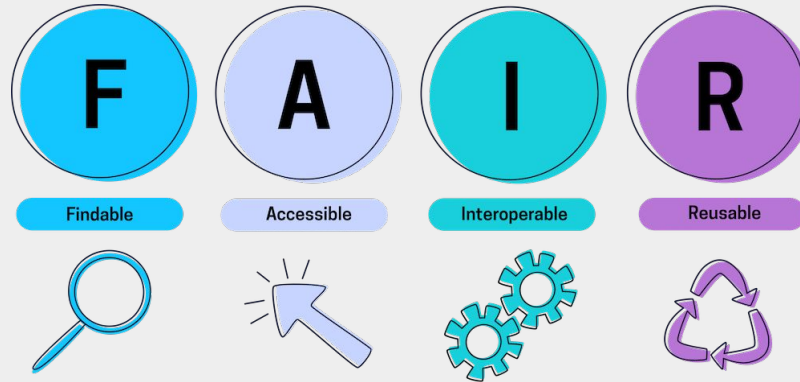
DOI:

[DOI 10.5072/zenodo.1236570](https://doi.org/10.5072/zenodo.1236570)

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deposit on
Zenodo



a FAIR dataset

download
from Zenodo

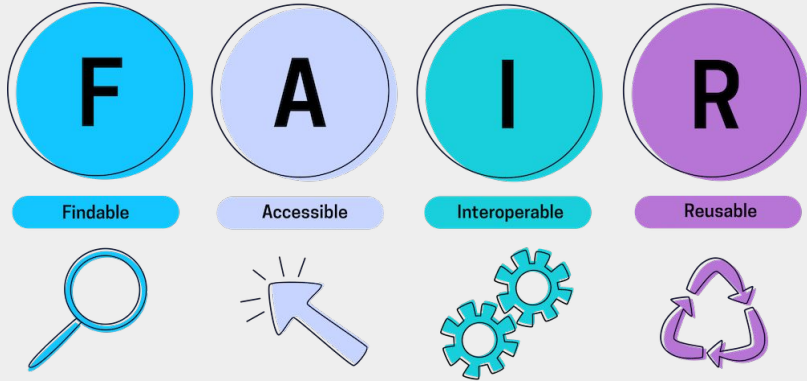
Files (107.7 kB)		
Name	Size	
datapackage.json	1.9 kB	
md5:63635ec1dbf8af354e5f06e1cbf10ad8		
scientific-publications-per-million.csv	105.8 kB	
md5:88ae98b3b816791004c7a0bd7929ab8e		

Publication date:
September 1, 2023

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[DOI 10.5072/zenodo.1236570](https://doi.org/10.5072/zenodo.1236570)

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deposit on
Zenodo



a FAIR dataset

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Files (107.7 kB)

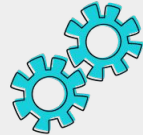
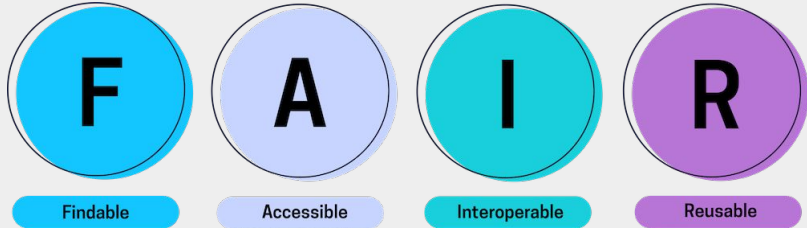
Name	Size	
datapackage.json	1.9 kB	
md5:63635ec1dbf8af354e5f06e1cbf10ad8		
scientific-publications-per-million.csv	105.8 kB	
md5:88ae98b3b816791004c7a0bd7929ab8e		

Publication date:
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Zenodo



open format
(csv)

use of
ISO codes

a FAIR dataset

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Publication date:
September 1, 2023

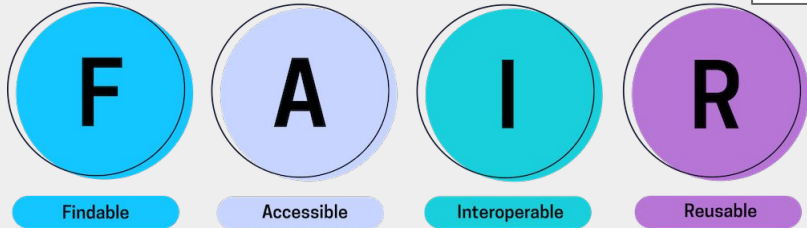
DOI:
DOI [10.5072/zenodo.1236570](https://doi.org/10.5072/zenodo.1236570)

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Name	Size	
datapackage.json	1.9 kB	Preview Download
md5:63635ec1dbf8af354e5f06e1cbf10ad8		
scientific-publications-per-million.csv	105.8 kB	Preview Download
md5:88ae98b3b816791004c7a0bd7929ab8e		

```
JSON Raw Data Headers
Save Copy Collapse All Expand All Filter JSON
profile: "tabular-data-package"
resources: [...]
  name: "scientific-papers-data-package"
  title: "Scientific papers data package"
  description: "Scientific and technical...les per million people "
  homepage: "https://ourworldindata.o...research-and-development"
  contributors: [...]
  licenses: [...]
```

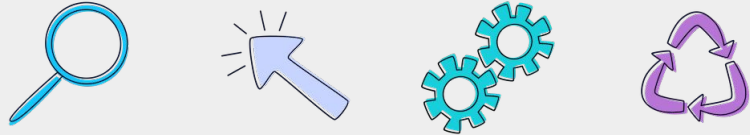
deposit on Zenodo



clear license

data dictionary

description



open format (csv)

use of ISO codes

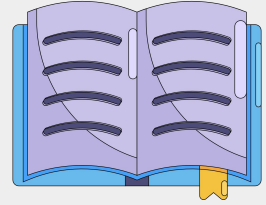
time for a little survey, please!



go to [menti.com](https://www.menti.com) and use
the code: 1962 9620

<https://www.menti.com/ol12w1gyzjxe>





resources

[How To FAIR](#)

[FAIR Cookbook](#)

[Top 10 FAIR Data & Software Things](#)

[FAIR training resources | FAIR Data 101](#)

[PARTHENOS Guidelines to FAIRify data management and make data reusable](#)

[The Turing Way](#)

[How to make your data FAIR](#)

[FAIRsFAIR](#)

[FAIRsharing](#)

[CARE Principles — Global Indigenous Data Alliance](#)

<https://twitter.com/hashtag/DataHorrorWeek>

vectors and icons from <https://www.svgrepo.com/>

THANK YOU!



Questions?

You can always email me at
paola.masuzzo@gmail.com

