



Managing your data

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How do you know how an old result was generated?



The Research Data Life Cycle

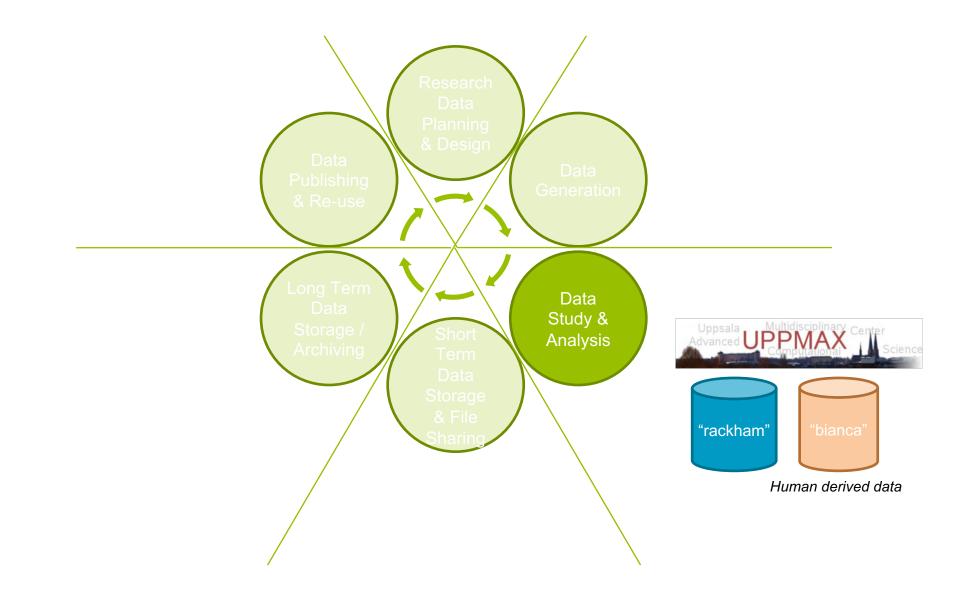
SciLifeLab





Study & Analysis

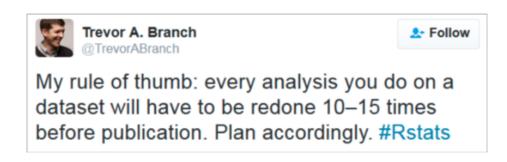


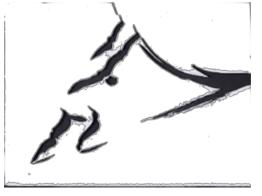






- Guiding principle
 - "Someone unfamiliar with your project should be able to look at your computer files and understand in detail what you did and why."
- Research reality
 - "Everything you do, you will have to do over and over again"
 Murphy's law







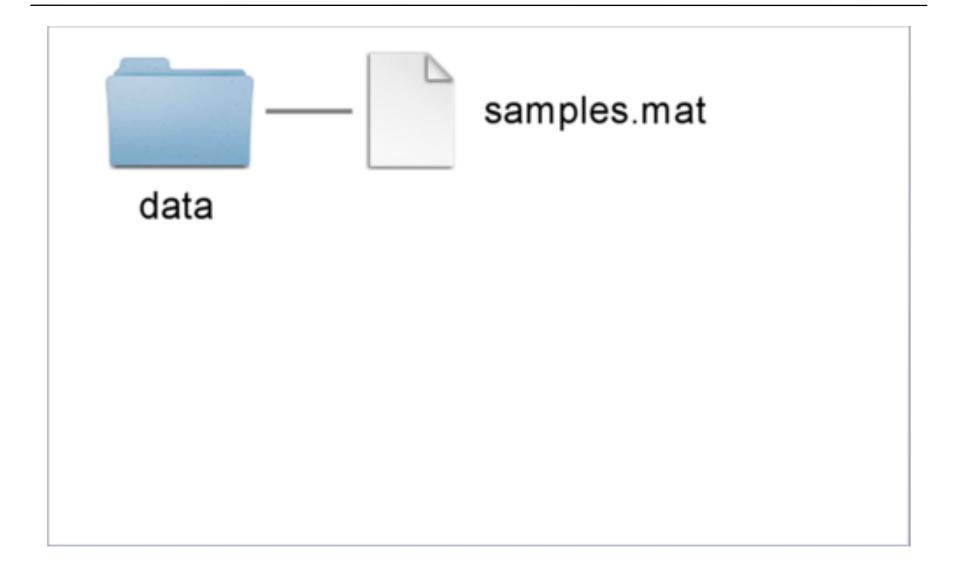
Poor organizational choices lead to significantly slower research progress

"Your primary collaborator is yourself six months from now, and your past self doesn't answer e-mails."



First step - Organization

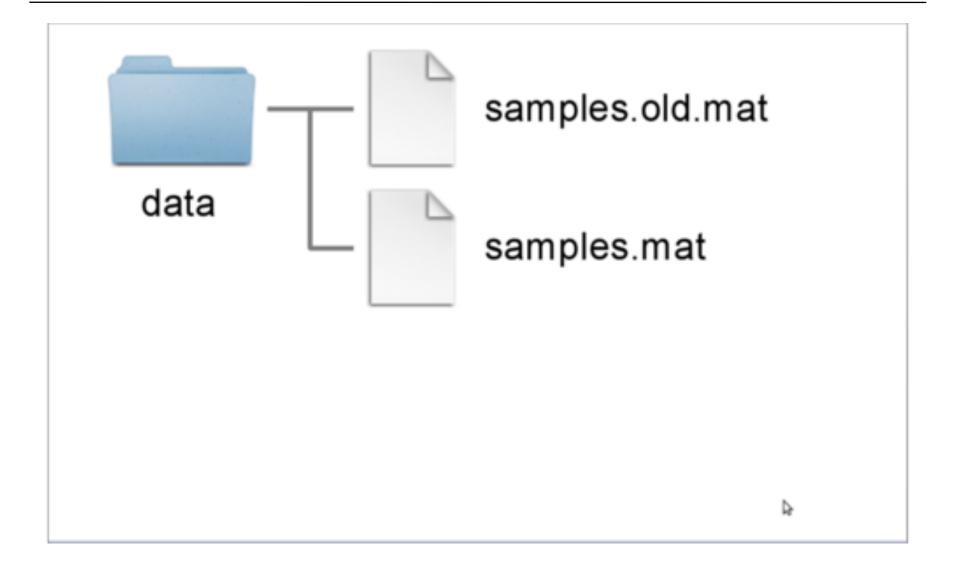








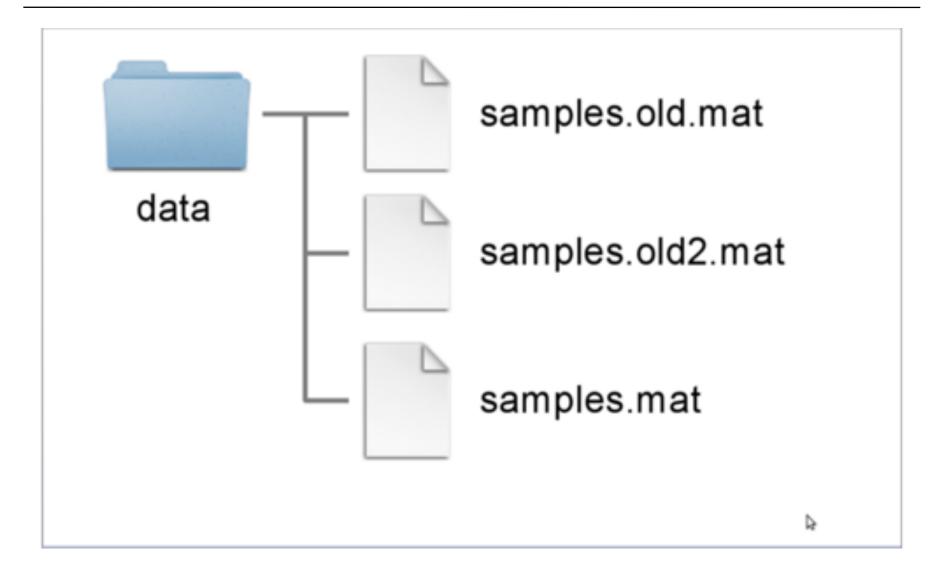






I guess this is alright



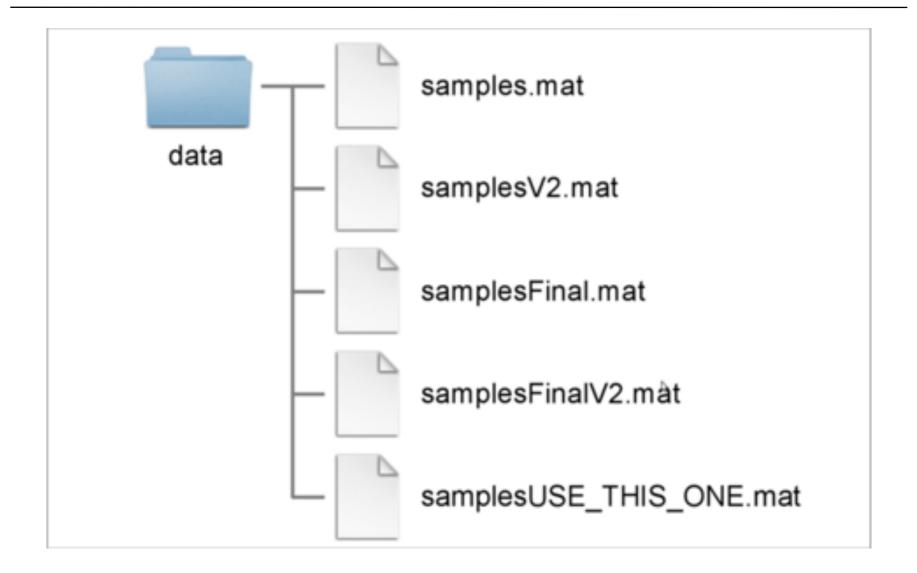




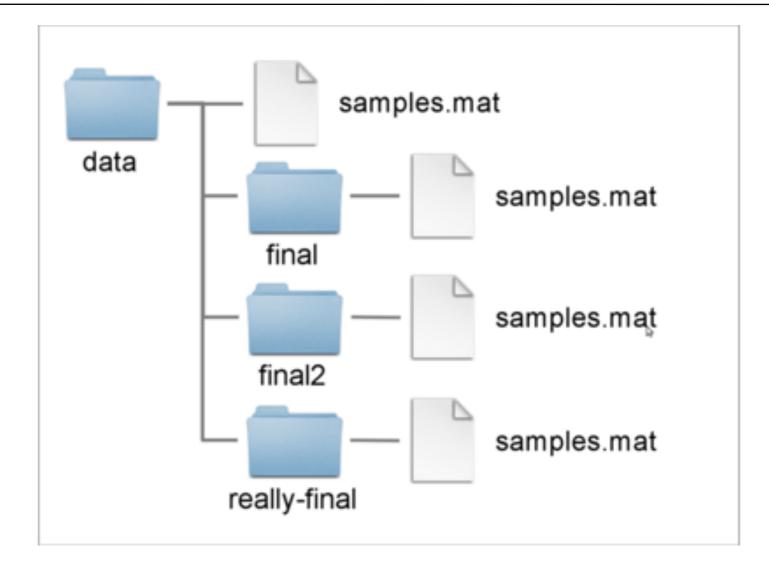
Which one is the most recent?

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Lab



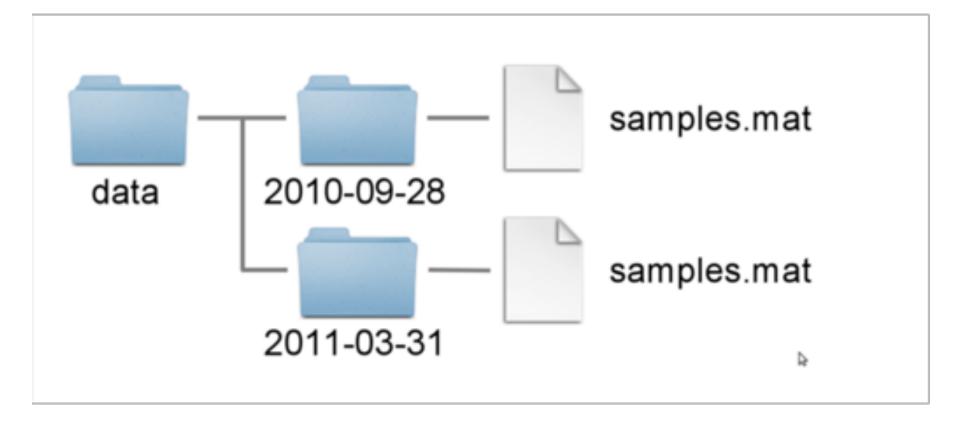






A possible solution

SciLifeLab







- There is a folder for the raw data, which do not get altered, or intermixed with data that is the result of manual or programmatic manipulation. I.e., derived data is kept separate from raw data, and raw data are not duplicated.
- Code is kept separate from data.
- Use a **version control system** (at least for code) e.g. **git**
- There is a **scratch directory for experimentation**. Everything in the scratch directory can be deleted at any time without negative impact.
- There should be a **README in every directory**, describing the purpose of the directory and its contents.
- Use **file naming schemes** that makes it easy to find files and understand what they are (for humans and machines)
- Use **non-proprietary formats** .csv rather than .xlsx
- Etc...





- What is it?
 - A system that keeps records of your changes
 - Allows for collaborative development
 - Allows you to know who made what changes and when
 - Allows you to revert any changes and go back to a previous state
- Several systems available
 - git, RCS, CVS, SVN, Perforce, Mercurial, Bazaar
 - git
 - Command line & GUIs
 - Remote repository hosting
 - GitHub, Bitbucket, etc



Clone / New Commit	Push Pull		M Git Flo	w Terminal Explorer Setting
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- Three principles
 - 1. Machine readable
 - 2. Human readable
 - 3. Plays well with default ordering

NO

myabstract.docx
Joe's Filenames Use Spaces and Punctuation.xlsx
figure 1.png
fig 2.png
JW7d^(2sl@deletethisandyourcareerisoverWx2*.txt

YES

2014-06-08_abstract-for-sla.docx joes-filenames-are-getting-better.xlsx fig01_scatterplot-talk-length-vs-interest.png fig02_histogram-talk-attendance.png 1986-01-28_raw-data-from-challenger-o-rings.txt





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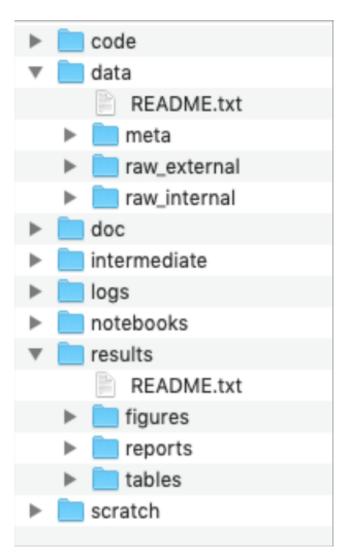


- A text-based format is more future-safe, than a proprietary binary format by a commercial vendor
- *Markdown* is a nice way of getting nice output from text.
 - Simple & readable formating
 - Can be converted to lots of different outputs
 - HTML, pdf, MS Word, slides etc
- Never, never, never use Excel for scientific analysis!
 - Script your analysis bash, python, R, …









all code needed to go from input files to final results raw and primary data, essentially all input files, **never** edit!

documentation for the study

output files from different analysis steps, *can be deleted* logs from the different analysis steps

output from workflows and analyses

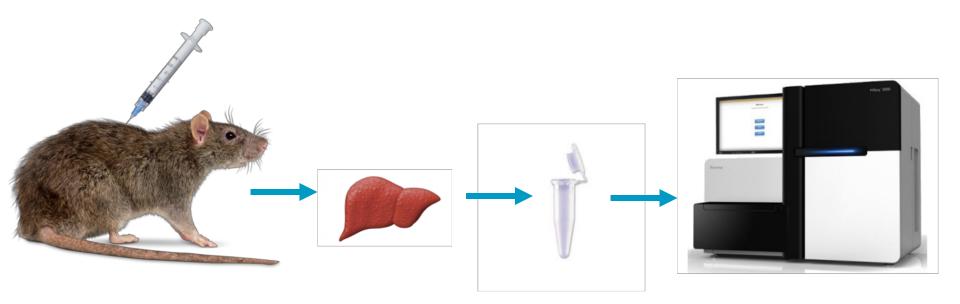
temporary files that can be safely deleted or lost

Noble WS (2009) A Quick Guide to Organizing Computational Biology Projects. PLoS Comput Biol 5(7): e1000424. http://journals.plos.org/ploscompbiol/article?id=info:doi/10.1371/journal.pcbi.1000424





- Need context → document **metadata**
 - From what was the data generated?
 - How do the samples differ?
 - What where the experimental conditions?
 - Etc

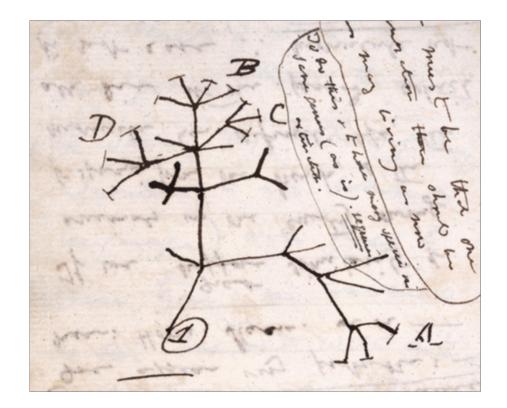




Lab notebooks



- Why?
 - You have to understand what you have done
 - Others should be able to reproduce what you have done





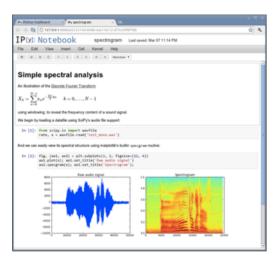


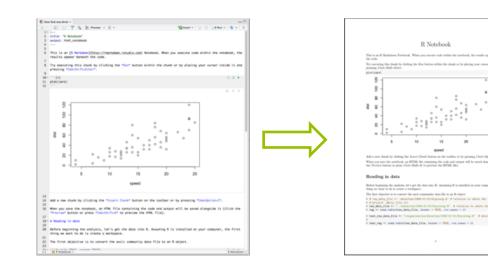
- Put in *separate* directory (e.g. *results*, *documentation*)
- *Dated* entries
- Entries relatively verbose
- Link to data and code (including versions)
 - Point to commands run and results generated
- Embedded images or tables showing results of analysis done
- Observations, Conclusions, and *ideas* for future work
- Also document analysis that *doesn't* work, so that it can be understood why you choose a particular way of doing the analysis in the end





- Paper Notebook
- Word processor program / Text files
- Electronic Lab Notebooks Systems
- 'Interactive' Electronic Notebooks
 - e.g. jupyther, <u>R Notebooks</u> in RStudio
 - Plain text work well with version control (Markdown)
 - Embed and execute code
 - Convert to other output formats
 - html, pdf, word

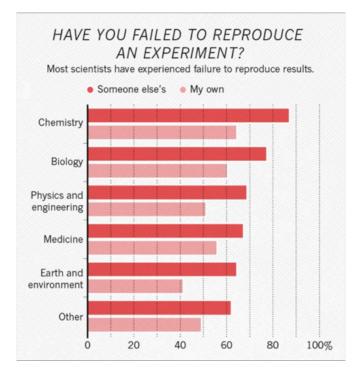


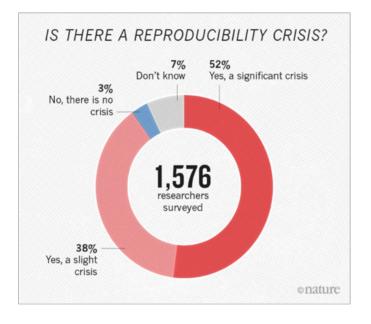




A reproducibility crisis







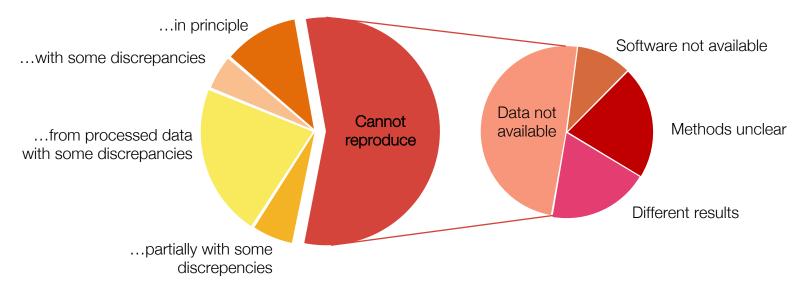


A reproducibility crisis



Reproduction of data analyses in 18 articles on microarray-based gene expression profiling published in Nature Genetics in 2005–2006:

Can reproduce...



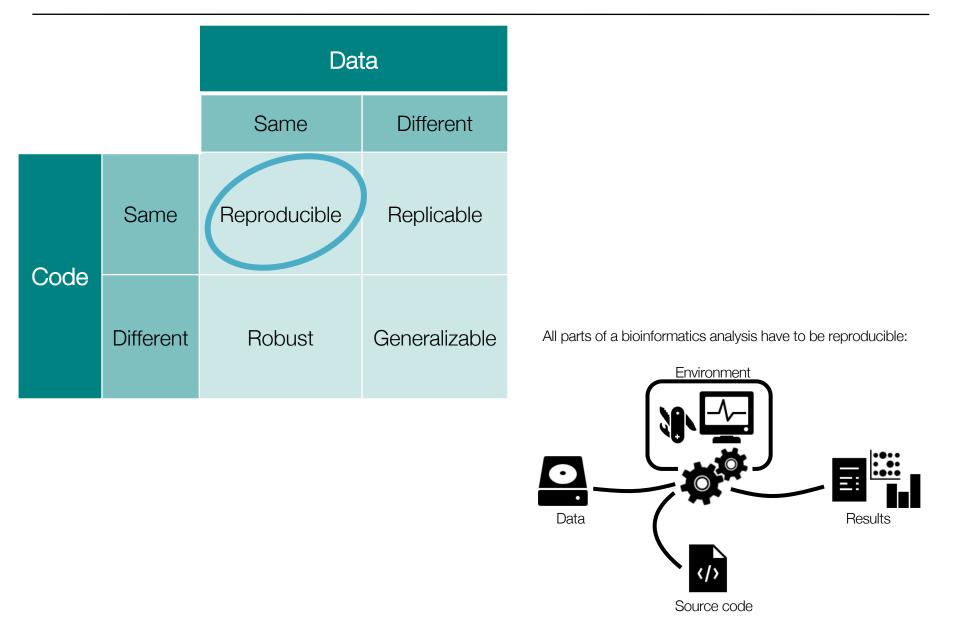
Summary of the efforts to replicate the published analyses.

Adopted from: loannidis et al. Repeatability of published microarray gene expression analyses. *Nature Genetics* **41** (2009) doi:10.1038/ng.295



What do we mean by reproducible research?

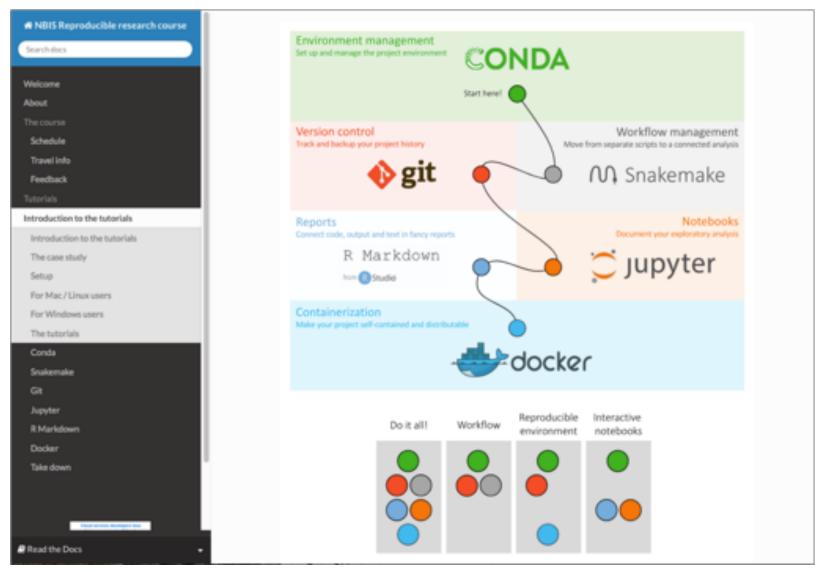






Reproducible Research tutorials



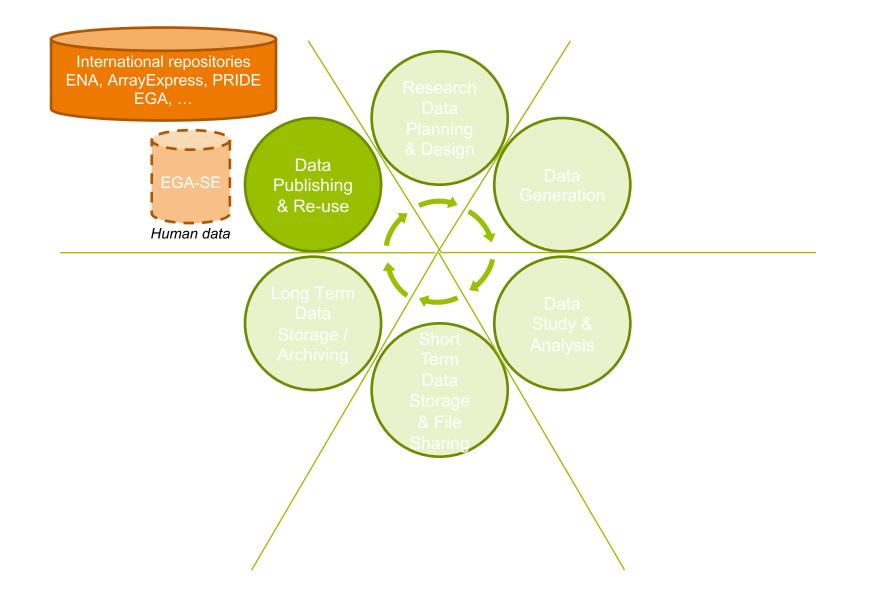


https://nbis-reproducible-research.readthedocs.io/en/course_1803/



Data Publishing & Re-use



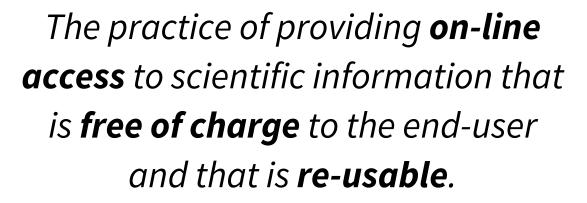






Why should you make research data available for others?







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- Democracy and transparency
 - Publicly funded research data should be accessible to all
 - Published results and conclusions should be possible to check by others
- Research
 - Enables others to combine data, address new questions, and develop new analytical methods
 - Reduce duplication and waste
- Innovation and utilization outside research
 - Public authorities, companies, and private persons outside research can make use of the data
- Citation
 - Citation of data will be a merit for the researcher that produced it

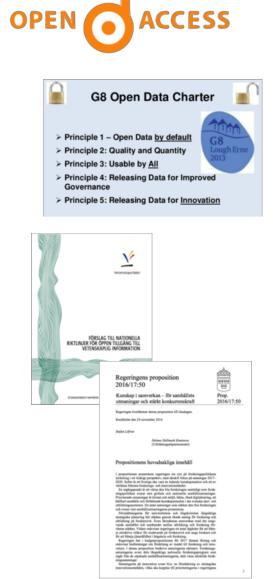




Open Access to research data



- Strong international movement towards Open Access (OA)
- European Commission recommended the member states to establish national guidelines for OA
 - Swedish Research Council (VR) submitted proposal to the government Jan 2015
- Research bill 2017–2020 *28 Nov 2016*
 - "The aim of the government is that all scientific publications that are the result of publicly funded research should be openly accessible as soon as they are published. Likewise, research data underlying scientific publications should be openly accessible at the time of publication." [my translation]
- 2018 VR assigned by the government to coordinate national efforts to implement open access to research data







What is needed for others to be able to re-use your data?







- To be useful for others data should be
 - FAIR Findable, Accessible, Interoperable, and Reusable
 ... for both Machines and Humans

Wilkinson, Mark et al. *"The FAIR Guiding Principles for scientific data management and stewardship"*. Scientific Data 3, Article number: 160018 (2016) <u>http://dx.doi.org/10.1038/sdata.2016.18</u>

	www.nature.com/scientificdata
SCIE	NTIFIC DATA
OPEN	Comment: The FAIR Guiding
SUBJECT CATEGORIES » Research data	Principles for scientific data
» Publication characteristics	management and stewardship
	Mark D. Wilkinson et al."
Received 10 December 2015 Accepted: 12 February 2016 Published: 15 March 2016	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 endores a concise and measureable set of principies 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 protection composition on 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.
	Supporting discovery through good data management Good data management is not a goal in itself, but rather is the key conduit leading to knowledge discovery and innovation, and to subsequent data and knowledge integration and reuse by the community after the data publication process. Uniformately, the existing digital ecosystem surrounding scholarly data publication process. Uniformately, the existing digital ecosystem research investments (e.g., eff.). Partially in rescores to this, science funders, oublinkers and

Box 2 | The FAIR Guiding Principles

To be Findable:

- F1. (meta)data are assigned a globally unique and persistent identifier
- F2. data are described with rich metadata (defined by R1 below)
- F3. metadata clearly and explicitly include the identifier of the data it describes
- F4. (meta)data are registered or indexed in a searchable resource

To be Accessible:

- A1. (meta)data are retrievable by their identifier using a standardized communications protocol
- A1.1 the protocol is open, free, and universally implementable
- A1.2 the protocol allows for an authentication and authorization procedure, where necessary
- A2. metadata are accessible, even when the data are no longer available

To be Interoperable:

- 11. (meta)data use a formal, accessible, shared, and broadly applicable language for knowledge representation.
- (meta)data use vocabularies that follow FAIR principles
- (meta)data include qualified references to other (meta)data

To be Reusable:

- R1. meta(data) are richly described with a plurality of accurate and relevant attributes
- R1.1. (meta)data are released with a clear and accessible data usage license
- R1.2. (meta)data are associated with detailed provenance
- R1.3. (meta)data meet domain-relevant community standards



SciLifeLab G20 HANGZHOU SUMMIT

'We support appropriate efforts to promote open science and facilitate appropriate access to publicly funded research results on findable, accessible, interoperable and reusable (FAIR)'

HANGZHOU, CHINA 4-5 SEPTE





- *Research Data Publishing is a cornerstone of Open Access*
- Long-term storage
 - Data should not disappear
- Persistent identifiers
 - Possibility to refer to a dataset over long periods of time
 - Unique
 - e.g. DOIs (Digital Object Identifiers)
- Discoverability
 - Expose dataset metadata through search functionalities



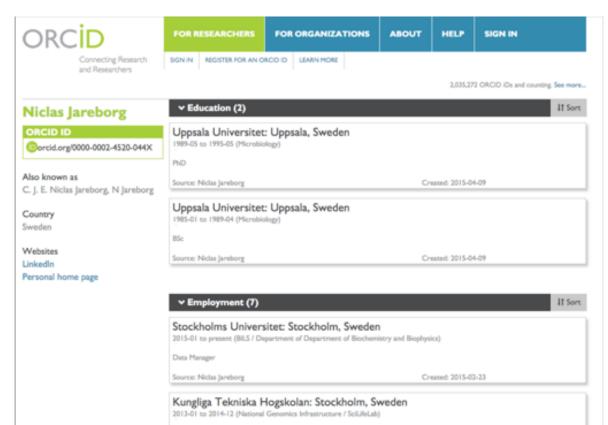








- ORCID is an open, non-profit, community-driven effort to create and maintain a registry of unique researcher identifiers and a transparent method of linking research activities and outputs to these identifiers.
- <u>http://orcid.org</u>
- Persistent identifier for you as a researcher

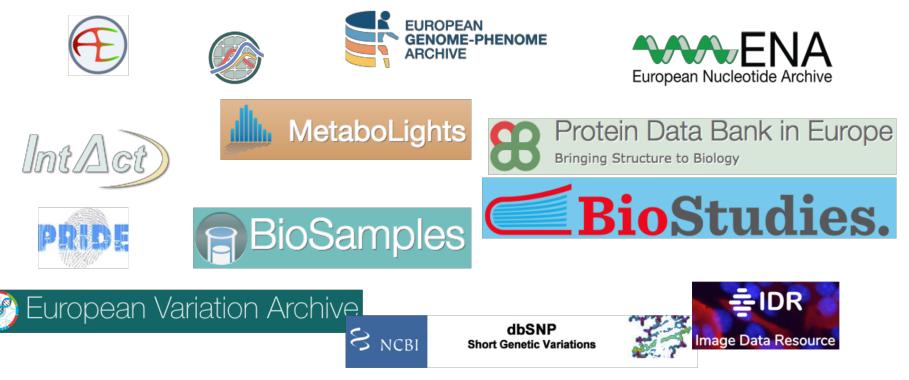








International public repositories



- Best way to make data **FAIR**
- Domain-specific metadata standards

Strive towards uploading data to its final destination already at the beginning of a project





ELIXIR Deposition Database list SciLifeLab

Deposition Database	Data type	International collaboration framework ¹	Deposition Database	Data type	International collaboration framework ¹
ArrayExpress	Functional genomics data. Stores data from high- throughput functional genomics experiments.		PDBe	Biological macromolecular structures.	wwPDB
BioModels	Computational models of biological processes.		PRIDE	Mass spectrometry-based proteomics data, including peptide and protein expression information (identifications and quantification values) and the supporting mass spectra evidence.	The ProteomeXchange
EGA	Personally identifiable genetic and phenotypic data resulting from biomedical research projects.	European Bioinformatics Institute and the Centre for			Consortium
			Pending incorporation into a Node Service Delivery Plan (see How countries join):		
		Genomic Regulation	BioSamples	BioSamples stores and supplies descriptions and metadata about biological samples used in research and development by academia and industry.	NCBI BioSamples database
ENA	Nucleotide sequence information, covering raw sequencing data, contextual data, sequence assembly information and functional and taxonomic annotation.		BioStudies	Descriptions of biological studies, links to data from these studies in other databases, as well as data that do not fit in the structured archives.	
IntAct	IntAct provides a freely available, open source database		EVA	The European Variation Archive covers genetic variation data from all species.	dbSNP and dbVAR
	system and analysis tools for molecular interaction data.		EMDB	The Electron Microscopy Data Bank is a public repository for electron microscopy density maps of macromolecular complexes and subcellular structures.	
MetaboLights	Metabolite structures and their reference spectra as well as their biological roles, locations and concentrations, and experimental data from metabolic experiments.				

https://www.elixir-europe.org/platforms/data/elixir-deposition-databases



result

umber of

<more generic



- Research data that doesn't fit in structured data repositories
- Data publication persistent identifiers
- Metadata submission not tailored to Life Science
 - Affects discoverability
 - (Less) FAIR
- Sensitive data a potential issue
 - Figshare https://figshare.com/
 - EUDAT http://eudat.eu/

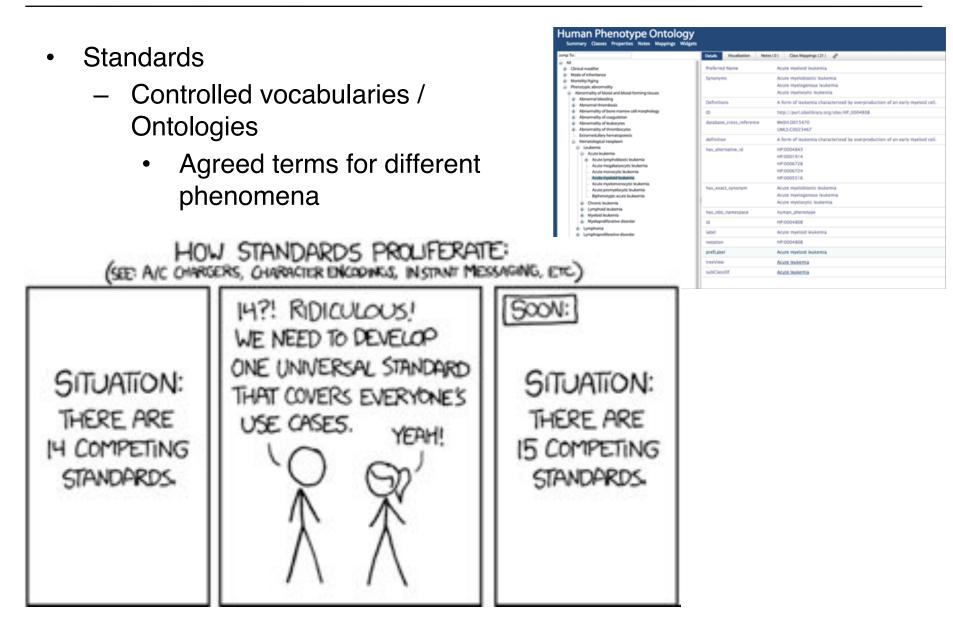
more specific >

- Data Dryad http://datadryad.org/
- Zenodo http://www.zenodo.org/



Interoperable & Re-useable Metadata

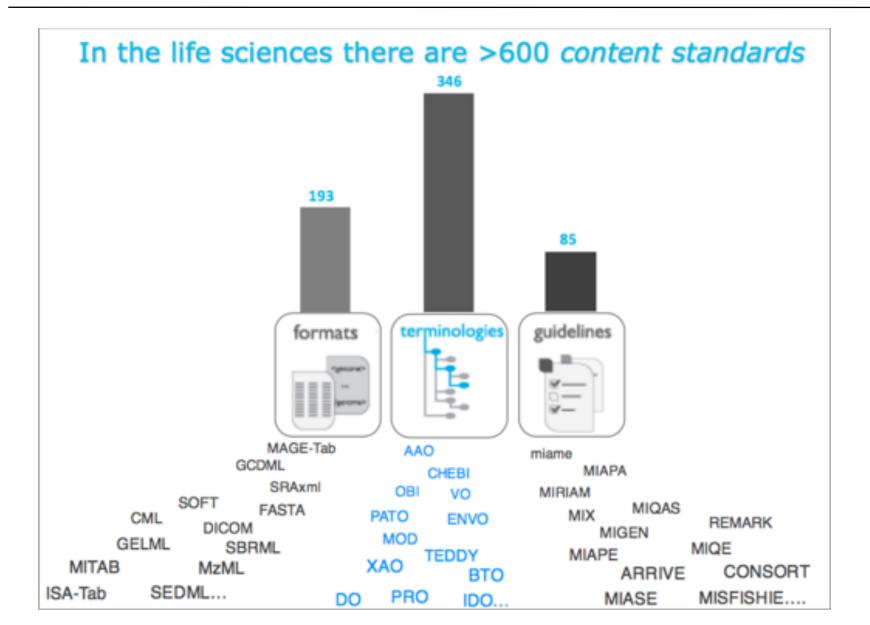






FAIRsharing.org







FAIRsharing.org

(was biosharing.org)



FAIRsharing.org	Standards Databases Policies (Collections Add/Claim Content Stats Log in or Register					
	A curated, informative and educational resource on data and metadata <i>standards</i> , across all disciplines, inter-related to <i>databases</i> and data <i>policies</i> .						
Find	Discover	Learn					
C Recommendations	©. Collections	Educational					
Standards and/or databases recommended by journal or funder data policies.	Standards and/or databases grouped by domain, species or organization.	About standards, their use in databases and policies, and how we can help you.					
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699 Standards Terminology Artifact 343	974 Databases	97 Policies Funder 22					
Model/Format 239 Reporting Guideline 117	Biomedical Science 181 General Purpose 10	Journal 68 Society 3					
View all	View all	Vewall					





Can you share all types of data publicly?

If not, what would be the reasons?





Personal data



Sci

- GDPR General Data Protection Regulation (*Dataskyddsförordningen*) + others
- Act concerning the Ethical Review of Research Involving Humans (*Lag om etikprövning av forskning* som avser människor)







- All kinds of information that is directly or indirectly referable to a natural person who is alive constitute personal data
- To process personal data:
 - All processing of personal data must fulfil the **fundamental principles** defined in the Regulation, among them are:
 - Decide a **purpose** and stick to it
 - Identify the **legal basis** for data processing before it starts
- Have you defined the purpose and legal basis for handling personal data in your project?





- Special categories (*Sensitive data*)
 - ... racial or ethnic origin, [...] genetic data, [...], data concerning health ... Art. 9 (1)
 - Processing is **prohibited** unless...
 - explicit consent is given Art. 9 (2)a
 - processing is necessary for **scientific research** in accordance with Article 89(1) based on Union or *Member State law* which shall be proportionate to the aim pursued, respect the essence of the right to data protection and provide for suitable and specific measures to safeguard the fundamental rights and the interests of the data subject. Art. 9 (2)j
 - Member State specific conditions and *limitations possible* for processing of health & genetic data Art. 9 (4)
 - Sweden
 - Consent?
 - Public interest → Ethical review necessary (often includes consent)







- A Data Protection Officer (dataskyddssombud)
 - The natural person that is responsible for ensuring that the organization/company adheres to the GDPR
 - Educate
 - Audit
 - Contact point between organization and Data Protection Agency

GU

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	https://medarbetarportalen.gu.se/projekt- process/aktuella-projekt/dataskyddsforordning
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	https://ki.se/medarbetare/gdpr-pa-karolinska-institutet
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_iU	
	https://insidan.liu.se/dataskyddsforordningen/anmalan-
	av-personuppgiftsbehandling?I=sv

LU

https://personuppgifter.blogg.lu.se

SU

https://www.su.se/medarbetare/organisationstyrning/juridik/personuppgifter/dataskyddsf%C3%B6r ordningen

UmU

https://www.aurora.umu.se/regler-ochriktlinjer/juridik/personuppgifter/

UU

https://mp.uu.se/web/info/stod/dataskyddsforordninge



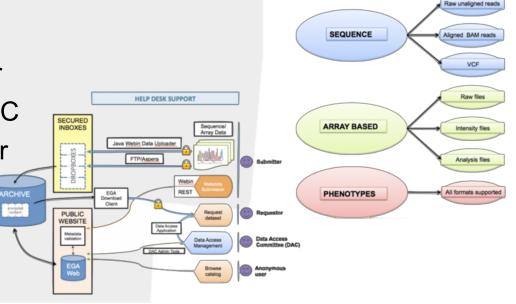
What about publishing sensitive data? Scil

"As open as possible, as closed as necessary"

EGA – European Genome-phenome Archive



- Repository that promotes the distribution and sharing of genetic and phenotypic data consented for specific approved uses but not fully open, public distribution.
- All types of sequence and genotype experiments, including casecontrol, population, and family studies.
- Data Access Agreement
 - Defined by the data owner
- Data Access Committee DAC
 - Decided by the data owner





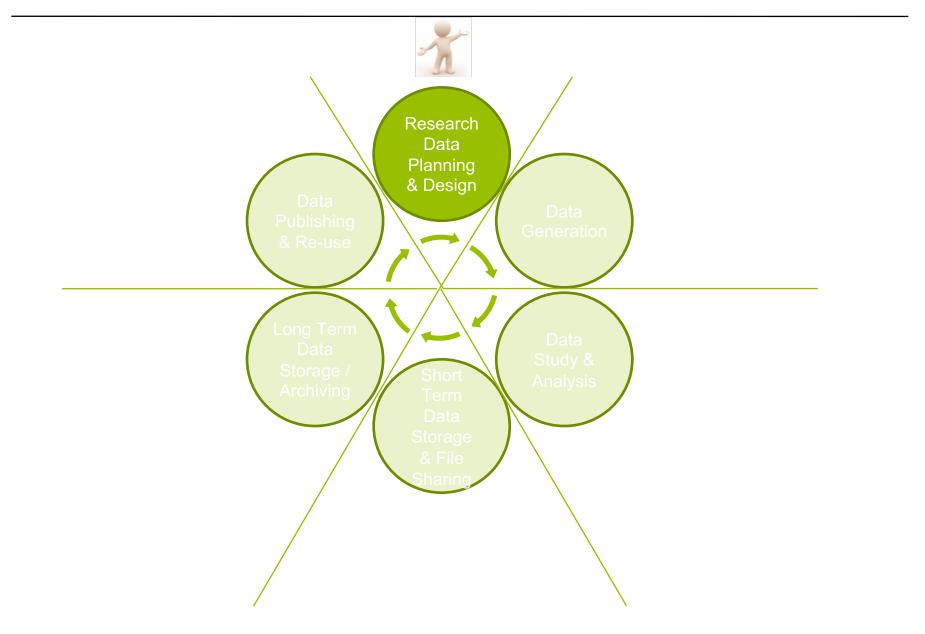


When should you start planning for how to manage you data?



Planning & Design









Will become a standard part of the research funding application process

- **Data collection** data types and volumes, analysis code
- **Data organization** folder and file structure, and naming
- Data documentation data and analysis, metadata standards
- **Data storage** storage/backup/protection & time lines
- **Data policies** conditions/licences for using data & legal/ethical issues
- **Data sharing** *When* and *How* will *What* data (and code) be shared
- Roles and responsibilities who's responsible for what & is competence available
- **Budget** People & Hardware/Software







© Consider structuring metadata in the format needed by the repository already at planning stage





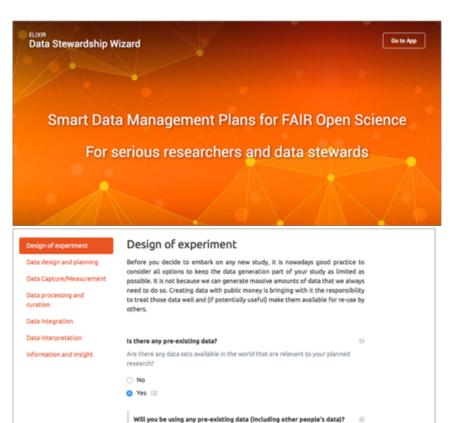
DMPonline



download funder templates without logging in, but the tool provides tailored guidance and example answers from the DOC and many research organisations. Why not sign up for an account and by it out?	

	hboard Create plans 🥔 Reference -	нер		🕅 Language -	🛔 Rob Hooft
OMP for a Zon	Mw Project				
Project Details Plan overview	Data Section Enabling Technologies Hotels	Detamanagement ZonMw S	hare Download		
expand all collapse all		9 answerst			
1. General information (0 / 11))				+
2. Legislation and regulations	(0 / 2)				+
3. Findable (0 / 4)					+
4. Accessible (0 / 3)					+
5. Interoperable (0 / 4)					+
6. Reusable (0 / 0)					+
7. Sustainable data storage (375)				+

ELIXIR Data Stewardship Wizard



Will you be referring to any earlier measured data, reference data, or data that should be mined from existing literature? Your own data as well as data from others?

O No Yes :=

What reference data will you use?

https://dmponline.dcc.ac.uk/

https://dsw.fairdata.solutions/



Sci

- Project planning
 - Metadata
 - File formats
 - Licensing
 - Data Management Plans
- Data analysis
- Data publication and submission
 - Support submissions to public repositories
 - Metadata
 - DOIs to dataset (if needed)





- Consider doing a Data Management Plan for your project
 - How do you ensure that your research output is FAIR?
- Plan for submitting "raw data" to public repositories as early as possible
- Organize project metadata from the start
 - In ways that makes it easy to submit to public repositories
 - Use available standards
- Pick a thought-through file and folder structure organization for your computational analyses
- Strive for reproducibility
 - Data & Code
- Be aware that there are legal aspects to processing human data
- Ask for help if you need it!





- Research Data Management, EUDAT <u>http://hdl.handle.net/11304/79db27e2-c12a-11e5-9bb4-2b0aad496318</u>
- Noble WS (2009) <u>A Quick Guide to Organizing Computational Biology Projects. PLoS</u> <u>Comput Biol 5(7): e1000424. doi:10.1371/journal.pcbi.1000424</u>
- Reproducible research
 - Reproducible Science Curriculum <u>https://github.com/Reproducible-Science-Curriculum/rr-init</u>
 - Leif Väremo & Rasmus Ågren
 - <u>https://bitbucket.org/scilifelab-lts/reproducible_research_example/src</u>
 - <u>https://nbis-reproducible-research.readthedocs.io/en/course_1803</u>
- GDPR
 - Datainspektionen <u>https://www.datainspektionen.se/lagar--</u> regler/dataskyddsforordningen/
- ... and probably others I have forgotten