

Programme O

Repositories for Research Data and Trusted Research Environments

Martin Weise with adapted slides from Andreas Rauber

Data Science Group Technical University of Vienna



Wevonal themsent

Motivation

Data is the new oil ... or "the new water" ... or "the new light"

v Brussels, Theresa May, 2017. The World's Most Valuable Resource, in *The Economist*. Edition May 6th. Martin Weise, Technical University of Vienna



Theresa May v Brussels

Ten years on: banking after the crisis

South Korea's unfinished revolution

Biology, but without the cells

The world's most valuable resource

Data and the new rules of competition

Motivation

Data is the new oil ... if properly managed! ... or "the new water" ... or "the new light"

Otherwise, it's an oilspill ... or flood ... or blinding flash of lighting

v Brussels, Theresa May, 2017. The World's Most Valuable Resource, in *The Economist*. Edition May 6th. Martin Weise, Technical University of Vienna



Motivation

Research depends on data in virtually all disciplines:

- Value of data determinded through
 - Exhaustive collection
 - Data (pre-)processing
 - Volume, e.g. meta-studies
 - Reproducability as core principle of science
- Proper data management enables
 - Speedup of research (avoiding repeated collection, processing)
 - Robust resarch (larger data pools)
 - Increased quality (reproducability, comparability)

Agenda



1. Introduction

- 2. Background
- 3. Repositories for Research Data
 - DSpace
 - Gitlab
 - InvenioRDM
 - DBRepo
- 4. Trusted Research Environments
 - RemoteNEPS
 - SAIL Gateway
 - DEXHELPP
 - OSSDIP
- 5. Future Work
- 6. Conclusion

1. Introduction



PreDoc Researcher in the first year

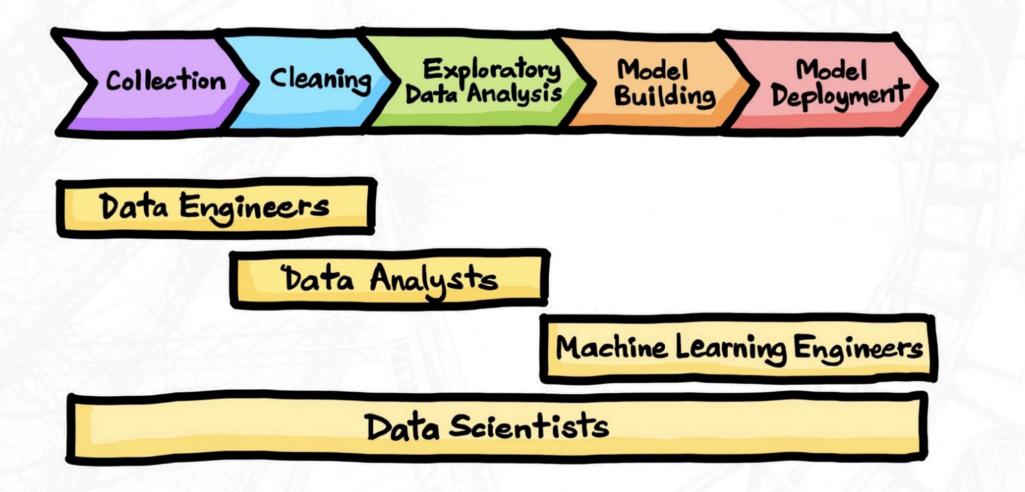
- MSc in Software Engineering & Internet Computing 2022 (Technical University of Vienna)
- BSc in Software & Information Engineering 2019 (Technical University of Vienna)

Research interests:

Making sensitive data FAIR







Nantasenamat, C. & Jee, K., 2020. [Online]. URL: <u>https://towardsdatascience.com/the-data-science-process-al9eb7ebc4lb</u>, accessed 2022-09-09 Martin Weise, Technical University of Vienna



Cleaning and preparing data takes about 80% of the total engineering effort

- Real-world data may be
 - incomplete, lacking attribute values, contains only aggregated data,
 - noisy, containing errors or outliers,
 - inconsistent, discrepancy in names
- Preparation generates a subset of the data, potentially increasing utility
 - attribute selection, relevant data, anomaly removal, duplicate elimination
 - reducing data, sampling or instance selection
- Outcome
 - recovery of incomplete data
 - *purify data*, correcting errors, removing outliers
 - resolve conflicts using domain knowledge, expert decisions

Zhang, S., Zhang, C. & Yang, Q., 2003. Data preparation for data mining, in *Applied Artificial Intelligence*, 17(5-6), p.375-381, DOI: 10.1080/713827180 Martin Weise, Technical University of Vienna

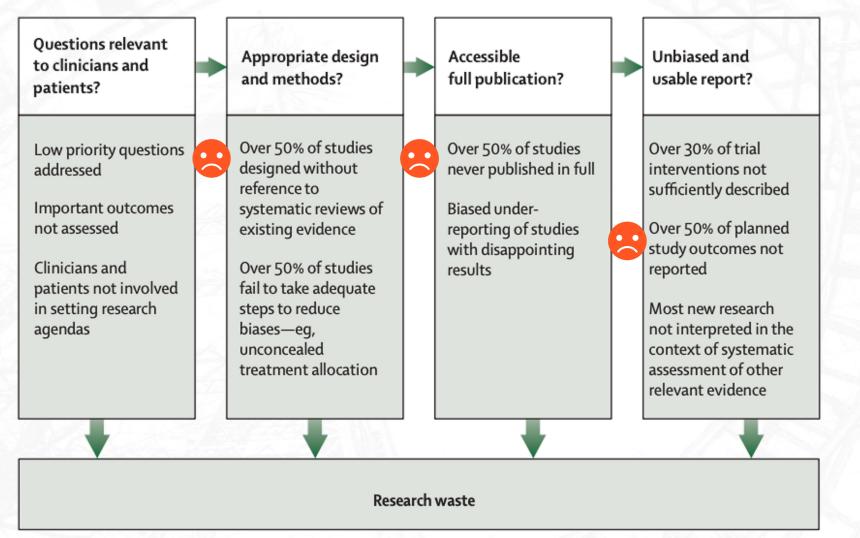


HEY, LOOK, WE HAVE A BUNCH OF DATA! I'M GONNA ANALYZE IT. NO, YOU FOOL! THAT WILL OWLY CREATE MORE DATA! After all this effort, people will be happy to re-use data, **right**?

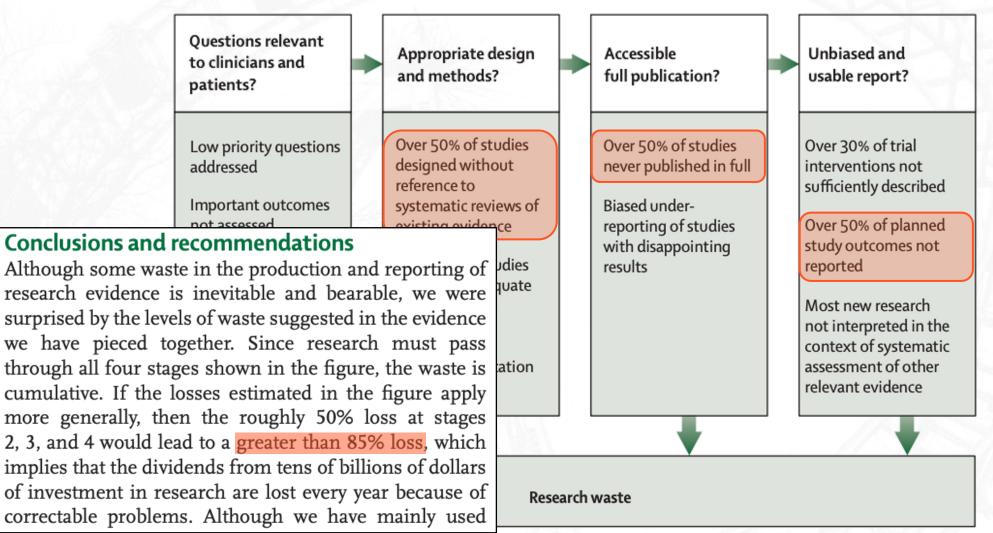
ALT: "It's important to make sure your analysis destroys as much information as it produces."

Munroe, R., 2022. Data Trap. [Online]. URL: <u>https://xkcd.com/2582/</u>, accessed 2022-09-11 Martin Weise, Technical University of Vienna





Chalmers, I., Glasziou, P., 2009. Avoidable Waste in the Production and Reporting of Research Evidence, in *The Lancet*, 374(9683), p.86-9. DOI: <u>10.1016/S0140-6736(09)60329-9</u> Martin Weise, Technical University of Vienna



Chalmers, I., Glasziou, P., 2009. Avoidable Waste in the Production and Reporting of Research Evidence. *Lancet.* 374(9683), p.86-9. DOI: 10.1016/S0140-6736(09)60329-9 Martin Weise, Technical University of Vienna

TU

2. Background

Why even share research data?

- Increase trust in the work, allow reproduce and validate findings
- Information is **valuable** to the research community
- **Contribute** work beyond the original findings
- Allow others to **re-use** and build on top of their data



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We contiously use the understanding gained by major thinkers in order to make intellectual progress.

Martin Weise, Technical University of Vienna

"If I have seen further it is by standing on the shoulders of Giants."

-Isaac Newton, 1675.

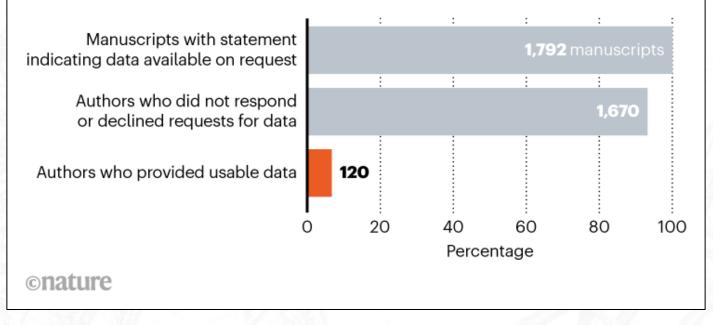
Is this necessary, why not just reasonably request data from researchers?



Is this necessary, why not just reasonably request data from researchers?

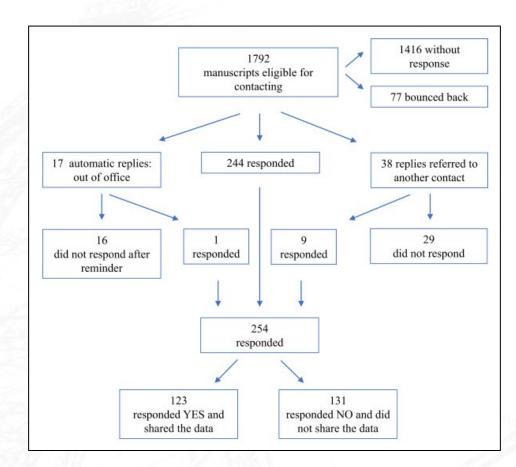
DATA-SHARING BEHAVIOUR

Of almost 1,800 manuscripts for which the authors stated they were willing to share their data, more than 90% of corresponding authors either declined or did not respond to requests for data. Only about 7% of authors actually handed over data.



Watson, C., 2022. Many researchers say they'll share data - but don't, in *Nature*, 606, p.853, DOI: <u>10.1038/d41586-022-01692-1</u> Martin Weise, Technical University of Vienna

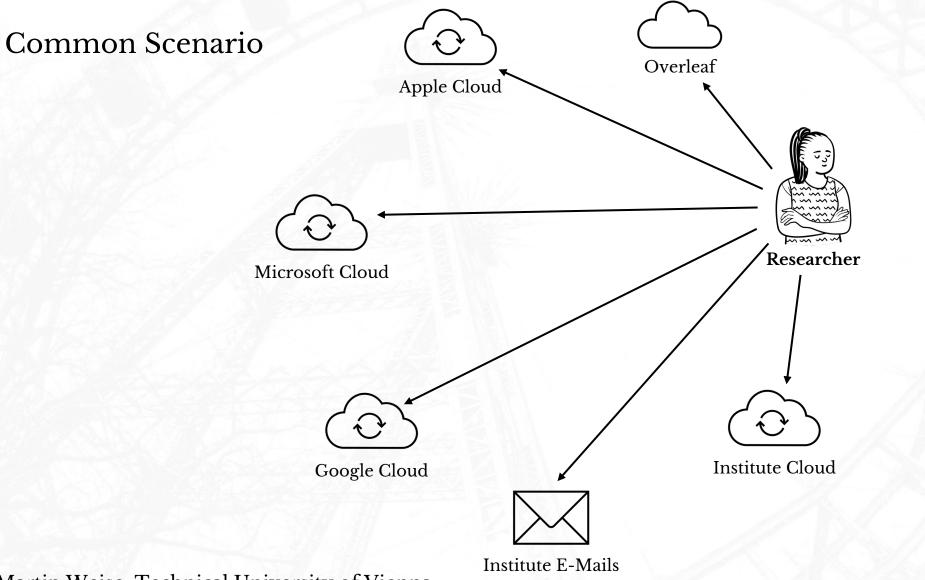
Is this necessary, why not just reasonably request data from researchers?



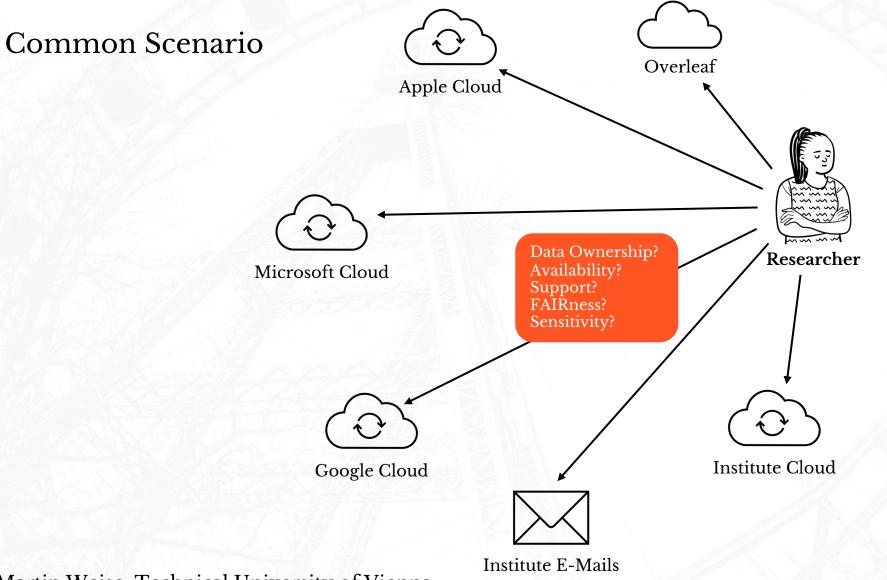
Gabelica, M., Bojčić, R. & Puljakc, L., 2022. Many Researchers were not Compliant with their Published Data Sharing Statement: a Mixed-methods Study, in *Journal of Clinical Epidemiology*, DOI: 10.1016/j.jclinepi.2022.05.019 Martin Weise, Technical University of Vienna











3. Repositories for Research Data OpenNEURO What are research data repositories? **GSA** for Human UniProt K Data Service HARVARD Dataverse DRYAD * **Science Data Bank \$OSF** 科学数据银行 Zenodo DEx **British** Geological BGS Survey fig**share TU Wien Research Data**

MENDELEY DATA

Data Management

- Currently largely on researcher's shoulders
- Need separation of concerns (excerpt)
 - Researchers, work with data, domain expertise
 - Data Stewards, curation, preservation, FAIR
 - *IT-Department*, hardware/software infrastructure, security, backup
 - Legal-Department, licenses, NDAs
 - Admin, reporting, GDPR, complicance
- Dedicated infrastructure to ensure data is properly managed and value realized
- Infrastructure for **research data management** connected to internal information systems, funders, etc.

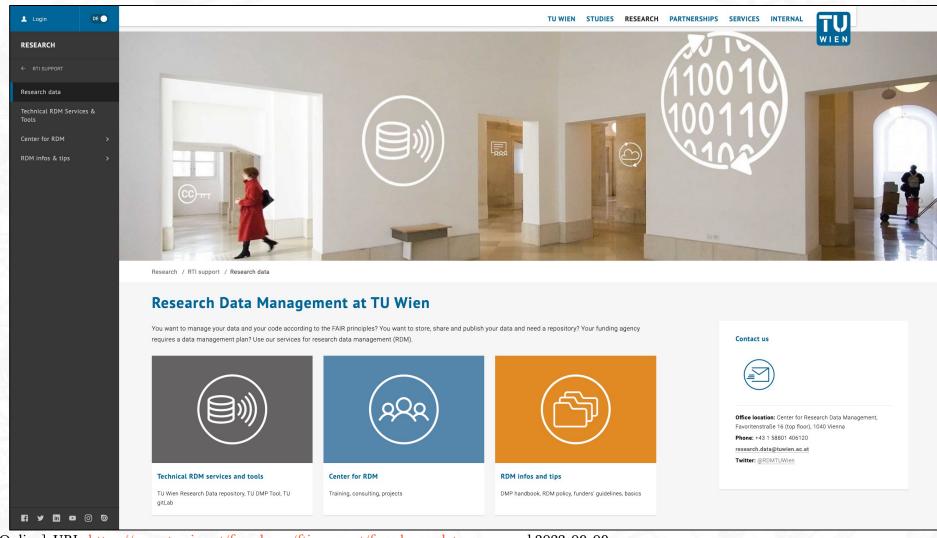
Research Data Management is a joint effort!



Steps towards research infrastructure at TU Vienna:

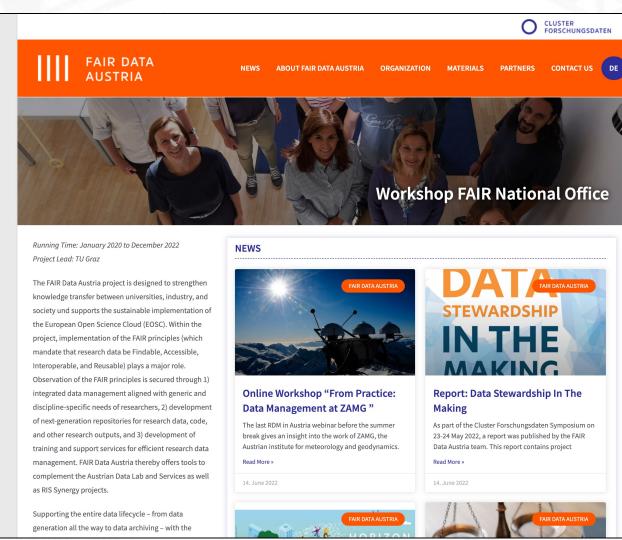
- Involved stakeholders, regular round tables (rectorate, support offices, research departments)
- Established **policy** on RDM
- Established Center for Research Data Management
- Devised plan for
 - National and European projects
 - FAIR Data Austria
 - Austrian Data Labs and Services
 - EOSC-* projects (European Open Science Cloud)
 - Involvement in Research Data Alliance (RDA), EGI, ...
 - Setting up and rolling out infrastructure





Research Data. [Online]. URL: <u>https://www.tuwien.at/forschung/fti-support/forschungsdaten</u>, accessed 2022-09-09 Martin Weise, Technical University of Vienna





FAIR Data Austria. [Online]. URL: https://forschungsdaten.at/en/fair-data-austria/, accessed 2022-09-09 Martin Weise, Technical University of Vienna

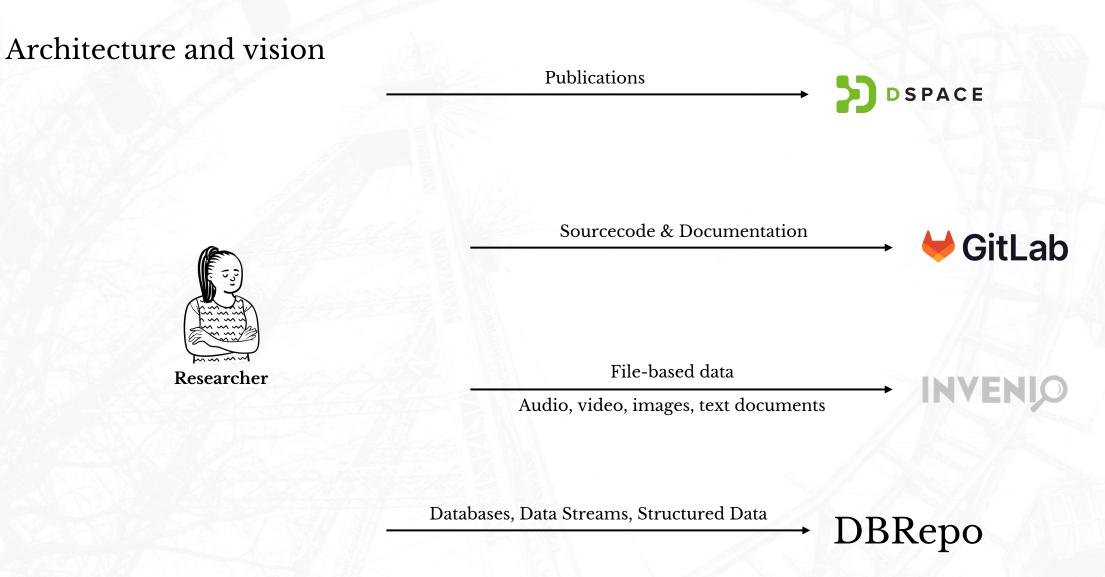
Repository Infrastructure

1. Repositories for all kinds of research material

- Input, output, interim
- Open and closed / sensitive data
- 2. Provide visibility
 - Citation, impact
 - FAIR compliant
- 3. Be largely transparent to researchers
 - Integration with TU and external infrastructure
- 4. Be trustworthy

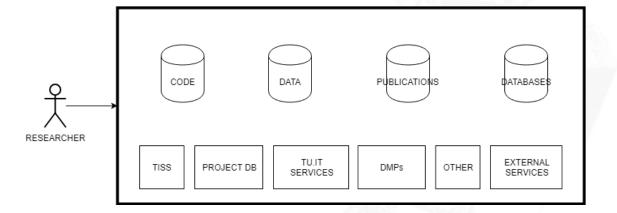






Repository Infrastructure

- Provide unified services for research data management
- Cooperation
 - Center for Research Data Management
 - TU.it
 - Campus Development Services
 - TU library
 - Research Unit Data Science (formerly IFS)
 - Central administration, legal department

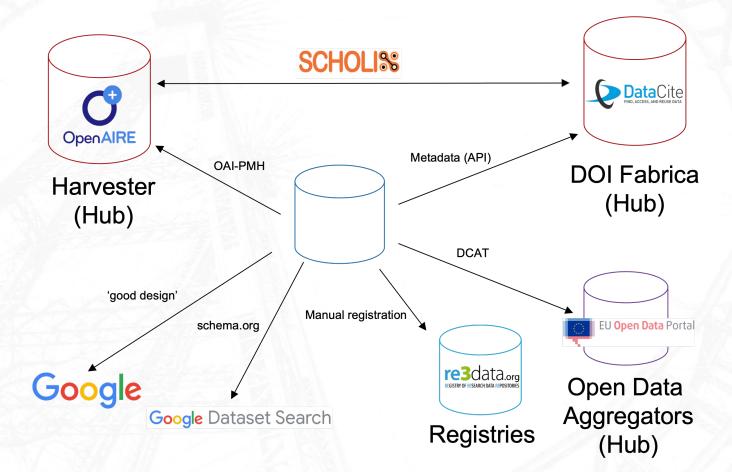


Systems integrated appear as a 'single repository'

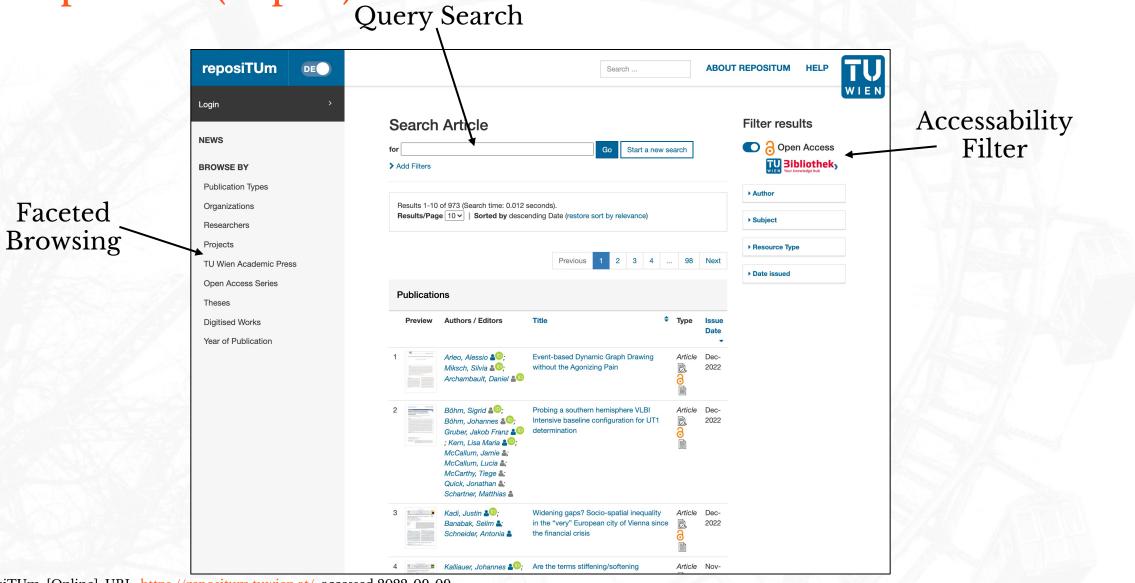




External Visibility: nobody searches in your repo to find data at first



3.1. ReposiTUm (DSpace)



ReposiTUm. [Online]. URL: <u>https://repositum.tuwien.at/</u>, accessed 2022-09-09 Martin Weise, Technical University of Vienna

3.1. ReposiTUm (DSpace)

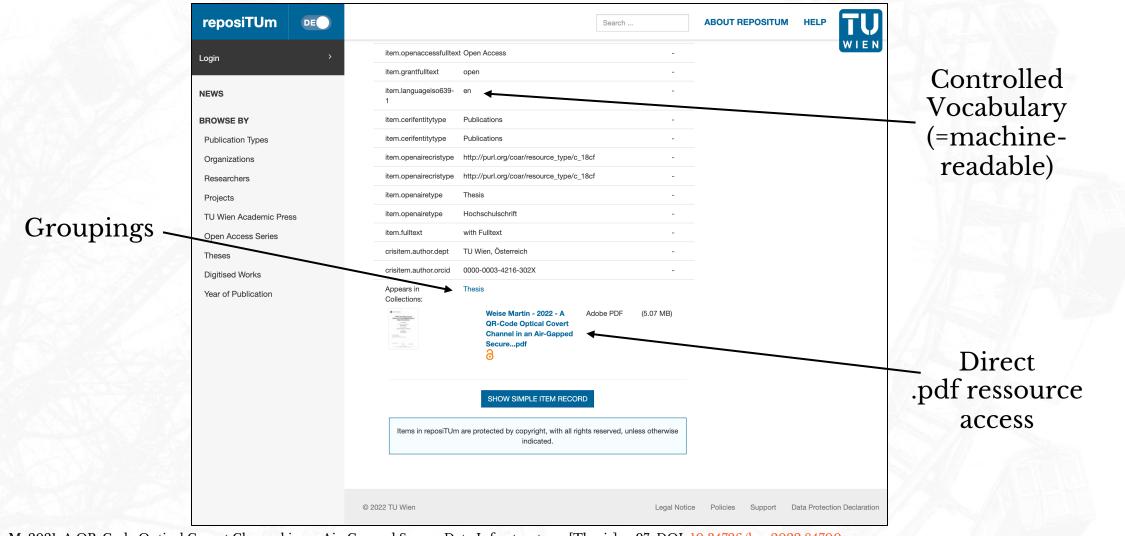


reposiTUm 🛛 🗖			Search		
Login	>				W
NEWS		Title:	A QR-Code optical covert channel in an air-gapped secure data infrastructure	en	Google Scholar [™] Check
BROWSE BY		Other Titles:	Optische Covert Channels in Sicheren Dateninfrastrukturer	n de	Спеск
Publication Types		Language:	English	-	
Organizations		Authors:	Weise, Martin 💵 💿	-	
Researchers		Qualification level:	Diploma	-	
Projects		Advisor:	Rauber, Andreas 🛔	-	
TU Wien Academic Press		Issue Date:	2021	-	
Open Access Series Theses		Citation:	Weise, M. (2021). A QR-Code optical covert channel in an air-gapped secure data infrastructure [Diploma Thesis, Technische Universität Wien]. reposiTUm. https://doi.org/10.34726/hss.2022.84700	-	
Digitised Works		Number of Pages:	97	-	
Year of Publication		Abstract:	Die gegensätzlichen Ziele über Schutz und Erhalt der Kontrolle über sensitive Daten, bei gleichzeitigem Gewähre des Zugriffs auf die Daten für Dritte, ist eine Herausforderung, Sichere Dateninfrastrukturen unterstütze Datenbesuche in einer hoch kontrollierten und überwachte betrieben, hohe Sicherheitsgarantien durch Kombination von technischen, rec Protection and ongoing confinement of sensitive data while also allowing third parties to visit the data is a conflict and constitutes a significant challenge. A secure data infrastructure that enables visiting the data in a restricted and monitored environment which provides high guarantee to keep the sensitive data confidential, if properly set-up and operated and through the combination of tec	n n	
		Keywords:	Covert Channel; QR-Code; Secure Data Infrastructure; Steganography	en	
		URI:	https://doi.org/10.34726/hss.2022.84700 http://ddl.bandle.net/20.500.12708/19275	-	

Weise, M, 2021. A QR-Code Optical Covert Channel in an Air-Gapped Secure Data Infrastructure. [Thesis], p.97, DOI: 10.34726/hss.2022.84700 Martin Weise, Technical University of Vienna

3.1. ReposiTUm (DSpace)





Weise, M, 2021. A QR-Code Optical Covert Channel in an Air-Gapped Secure Data Infrastructure. [Thesis], p.97, DOI: <u>10.34726/hss.2022.84700</u> Martin Weise, Technical University of Vienna

3.2. Gitlab



Single Sign-On - (e.g. eduroam is also SSO)

🔶 🔛 🤃

Username or email

TUgitLab



GitLab Service der TU.it

Git ist eine Software zur verteilten Versionsverwaltung von Dateien (im Speziellen von Source-Code). Mit TUgitLab stellt TU.it eine Webanwendung für die Verwaltung von Repositories auf Basis von Git zur Verfügung. TU-Angehörige mit einem aktiven TUaccount können dieses Service im Rahmen der Mitarbeit an GitLab-Projekten nützen. Um die dafür notwendigen Berechtigungen zu erlangen, wenden Sie sich bitte an Ihren zuständigen TUgitLab-Institutsadministrator oder GitLab-Projekt-Verantwortlichen. Der Login erfolgt auf dieser Seite unter **TU Wien SS0**.

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ce-Code). Mit TUgitLab stellt
ie Verwaltung von
ur Verfügung. TU-Angehörige
innen dieses Service im
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gen zu erlangen, wenden Sie
TUgitLabab-Projekt-Verantwortlichen.
werden Zill Viere CEO

Pilot-Projekt

- TUgitLab-Institutsadministratoren
- Externe Benutzer

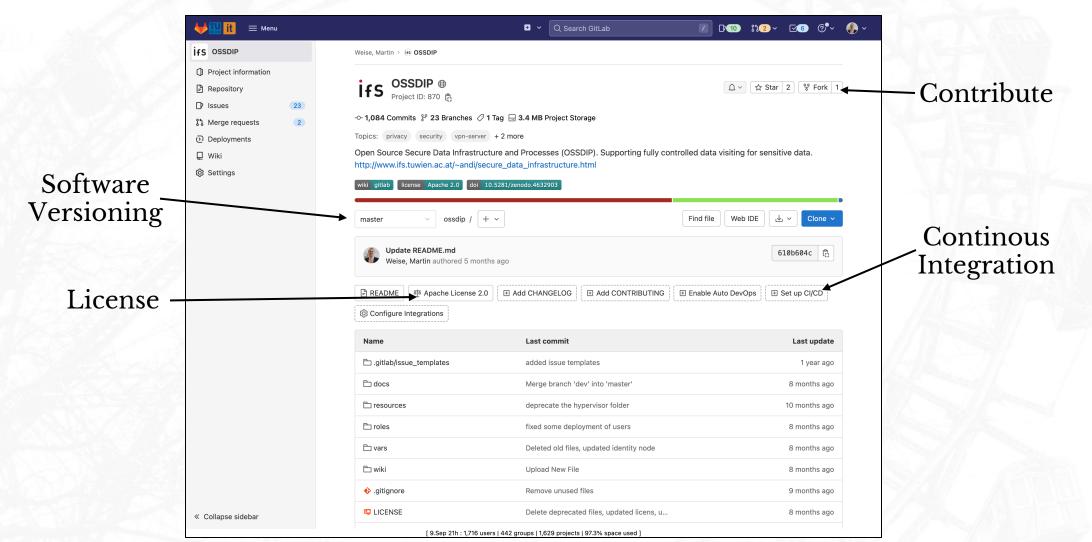
Weitere Informationen (FAQ) und unsere Dienstleistungserklärung entnehmen Sie bitte der Servicebeschreibung bzw. wenden Sie sich an unser Service Center.

Forgot your password?

[9.Sep 18h : 1,716 users | 442 groups | 1,629 projects | 97.3% space used]

Gitlab. [Online]. URL: <u>https://gitlab.tuwien.ac.at/</u>, accessed 2022-09-09 Martin Weise, Technical University of Vienna

3.2. Gitlab



OSSDIP. [Online]. URL: https://gitlab.tuwien.ac.at/martin.weise/ossdip, accessed 2022-09-09

3.3. Research Data Repository (InvenioRDM)

- Make digital objects FAIR
- Suitable for research data
- Not for publications
 - Other system exists (ReposiTUm)
- Running since December 2020

More details will be presented later today!

ት)Log in	HOME COMMUNITIES MY DASHBOARD	_TU
Published August 8, 2022 Version 0.0	Dataset Gen Versions	WIEI
l Can Tell by Your Eyes! Continuous Ga Prediction Reveals Spatial Familiarity		ug 8, 2022
Alinaghi, Negar ¹	Show affiliations Details	
Editors: Giannopoulos, Ioannis ^{1,2} (); Kattenbeck, Markus	Show affiliations DOI DOI 10.48436/f0cHy-11p06 DOI 10.48436/f0cHy-11p06	
Citation	Style APA Page Dataset	
Alinaghi, N. (2022). I Can Tell by Your Eyes! Continuous Ga: Prediction Reveals Spatial Familiarity (0.0) [Data set]. TU W https://doi.org/10.48436/f0chy-11p06		
Description The data used for the analysis in the paper entitled "I Can ' Activity Prediction Reveals Spatial Familiarity" published Files	Tell by Your Eyes! Continuous Gaze-Based Turn-	m 4.0
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TU Wien Research Data. [Online]. URL: <u>https://researchdata.tuwien.ac.at/</u>, accessed 2022-09-09 Martin Weise, Technical University of Vienna

3.4. DBRepo

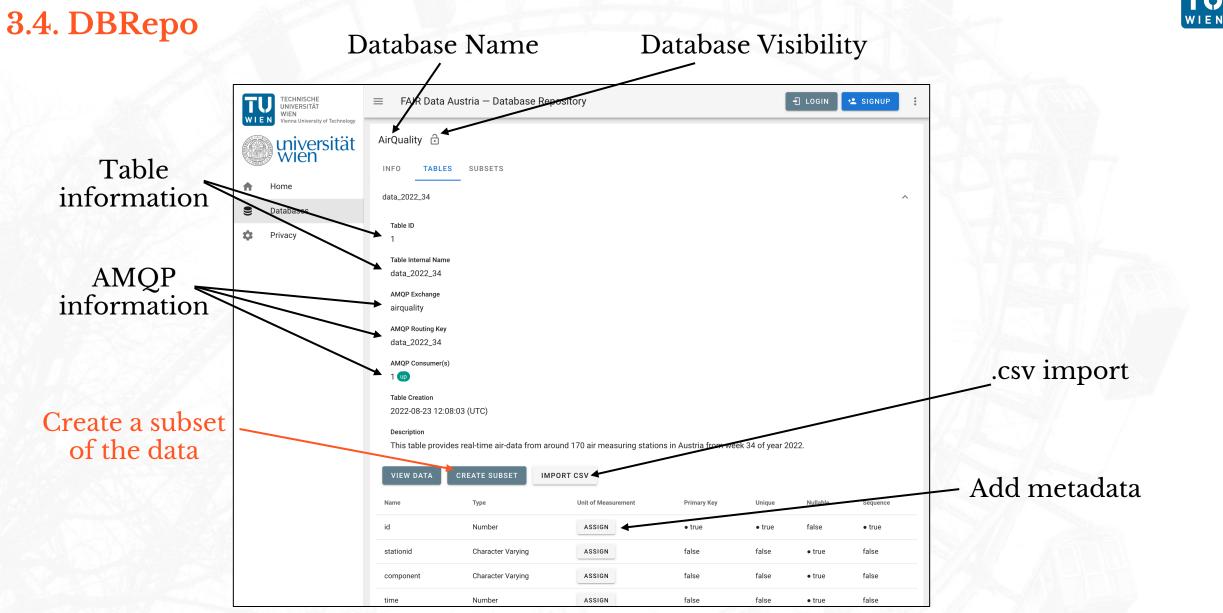
- Invenio can handle collection of files well
- How about relational data in databases?
 - Releasing a data dump every x amount of time?
 - Adding continous data streams, e.g. IoT?
 - How to update / correct data in those databases?
 - Allow reproduction of any subset?
- Private cloud-based environment?
- Dump the data after the end of a project into some repository to fulfill some grant agreement?

	A 🖌	В	С	D	E	F	G
	1 ID_MORE				variant	value	unit_of_measure
	2 10005			river load	Median	0,156947457	
	3 10005			river concentration		0,000713125	
	4 10005			river load	Median	0,162680833	
	5 10005			emission	Median	0,162596195	•
	6 10005			river concentration		0,000692205	
	7 10005			emission	Median	0,157826458	kg/a
	8 10005			river concentration	Median	0,000687399	µg/l
	9 10005	2016	PFOA	emission	Median	0,162680833	kg/a
	10005	2017	PFOS	river load	Median	0,157826458	kg/a
	10005	2016	PFOA	river concentration	Median	0,00071251	µg/l
	10005	2016	PFOS	emission	Median	0,156947457	kg/a
lame			/	Size			
catchments_gml.zip		/		8.3 MiB		Preview	🛓 Download
atchments_shp.zip				8.3 MiB		Preview	🛓 Download
	ads.csv			2.3 MiB		Preview	🛓 Download
missions_per_pathway.csv				12.0 MiB		Preview	🛓 Download

Kittlaus, S., 2022. Modelled emissions, river loads and river concentrations for PFOA and PFOS in 2016/2017 in Austrian surface waters (1.0) [Data set]. DOI: 10.48436/jpzv9-c8w75 Martin Weise, Technical University of Vienna

3.4. DBRepo

- Cloud hosted repository for structured research data
- Supports data versioning & citeability via query store and dynamic data citations (Recommendations of RDA WGDC)
- Microservice architecture
- Each database encapsulated in a Docker container
- Central metadata database
- APIs for different levels of SQL-knowledge:
 - Web interface, support for CSV import,...
 - REST, message queue for data streams



Taha, J. & Weise, M., 2022. AirQuality. [Dataset]. URL: <u>https://dbrepo.ossdip.at/container/l/database/l/table</u>, accessed 2022-09-10 Martin Weise, Technical University of Vienna



Query Builder for Export DataCite Export .csv Metadata simple subsets TECHNISCHE UNIVERSITÄT WIEN Vienna University 🕣 LOGIN 🛛 😫 SIGNUP + SIGNUP WIEN WIEN ienna University of Tech Create Subset 🖈 EXECUTE Early stage Researchers' Training Week Subset DATA .CSV METADATA .XML niversität universität wien wien SIMPLE EXPERT Subset Information Home Home **f** ft. P Database Visibility Table Columns Databases Databases data_2022_34 9 stationid, component, time, unit, meantype, value, meta_name, Public meta_owner, meta_location, x_coord, y_coord, z_coord Database Name 🏟 Privacy ÷ Privacy AirQuality 09:STEF where stationid **v** = Ê Persistent Identifier Ô http://dbrepo.ossdip.at/pid/55 and where - component - = AND OR Early stage Researchers' Training Week Subset **Data**Cite Metadata SELECT Description `stationid` This is a saved subset for the training week at Sapienza University, (Rome, Italy). `component`, Creators `time`, `unit` Weise, M. TU Wien `meantype` Publication Date `value`, 2022-09-10 No data available Query Statement select `stationid`, `component`, `time`, `unit`, `meantype`, `value`, `meta_name`, `meta_owner`, Rows per page: 10 --< `meta_location`, `x_coord`, `y_coord`, `z_coord` from `data_2022_34` where `stationid` = '09:STEF and `component` = 'Ozon' Databases / 1 / Oueries Subset Hash sha256:165294a6bb3ebd8731901ba2b003165d83bc891ed9c330eeff9d60a7fa109 x coord meta own meta location v coord meta nam Gemeinde Wien - MA22 0 Ozon Stephansplatz "Stephansdom Umweltschutz Gemeinde 0 Ozon Wien - MA22 Stephansplatz "Stephansdom This is a TEST environment, do not use production/confidential data! - Report a bug Umweltschutz

Have a look yourself



Weise, M., 2022. Early stage Researchers' Training Week Subset. [Dataset]. URL: <u>https://dbrepo.ossdip.at/pid/55</u>, accessed 2022-09-10 Martin Weise, Technical University of Vienna

Metadata makes databases findable (as in <u>F</u>AIR)

- Container name
- Database name, description, -license
- Table name
 - Column name, -type, -uniqueness, -nullability, -date format
 - Column measurement unit (controlled vocabulary)
 - Statistical properties

http://www.ont	ology-of-units	-of-measure.org/resource/om-2/second-Time	Dow
Туре	singular unit		
	unit		
Literals	Property	Value	Languag
	comment	The second is a unit of time defined as the duration of 9 192 631 770 periods of the radiation corresponding to the transition between the two hyperfine levels of the ground state of the cesium 133 atom.	en
	label	second	en
	label	seconde	nl
	label	秒	zh
	longcomment	The second is a unit of time defined as the duration of 9 192 631 770 periods of the radiation corresponding to the transition between the two hyperfine levels of the ground	en
		state of the cesium 133 atom. The second is a base unit in the International System of Units.	
Other relations	Related conce	Units.	Concept
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Foodvoc. [Online]. URL: http://www.ontology-of-units-of-measure.org/resource/om-2/second-Time, accessed 2022-09-10 Martin Weise, Technical University of Vienna



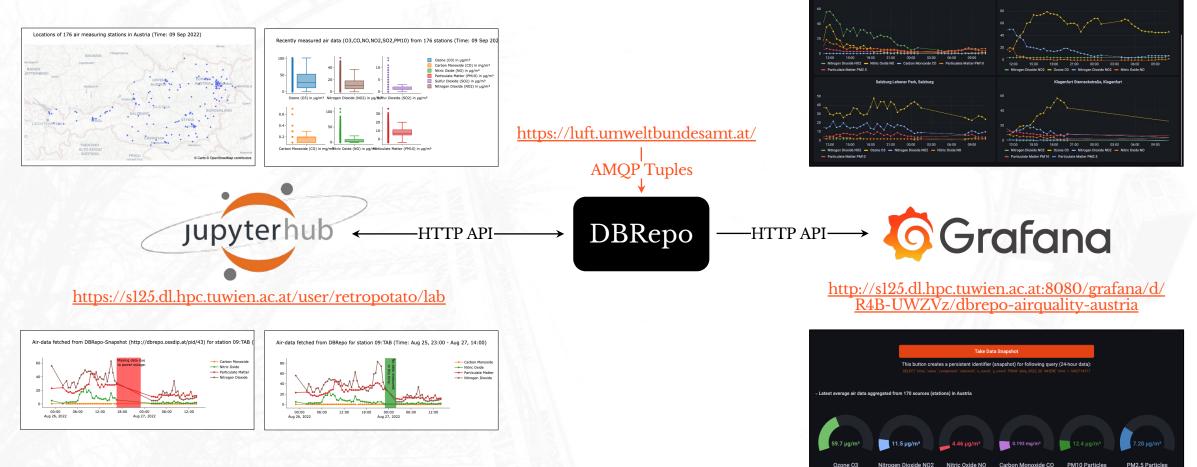
Persistent identification of arbitrary subsets of data

- Each query issued to the database is saved in the Query Store
- Attaching **metadata** to a query statement, following the DataCite schema
- Mirror the query metadata to DBRepo's central database
- Allows precise data citation
- Implements recommendations of the RDA WGDC

R1 – Data Versioning	R2 – Event Timestamping	R4 – Unique Queries	R7 – Query Timestamping	R8 – Query PID	R9 – Store Query Metadata	R5 – Stable Sorting	R6 -Result Set Verification	R10 – Citation Texts	R11 – Human Readable	R12 – Machine Actionable
			Qu	iery		Resu	lt Set	Land	ling Pa	ages
Data Store			3	- (Qι	lei	y	St	or	е
R13 - Technology Migration										
R14 - Migration Verification										

Rauber, A., et al, 2021. Precisely and Persistently Identifying and Citing Arbitrary Subsets of Dynamic Data, in *Harvard Data Science Review*, 3(4). DOI: 10.1162/99608f92.be565018 Martin Weise, Technical University of Vienna

Simple use-case:



24 hour air data measured from specific stations in Austria

3.4. DBRepo Further Reading



Material

- <u>https://indico.egi.eu/event/5882/contributions/16724/</u> (EGI'22 Poster)
- <u>https://doi.org/10.5281/zenodo.6637333</u> (IDCC'22 paper)
- https://doi.org/10.17605/OSF.IO/B7NX5 (iPRES'21 paper)

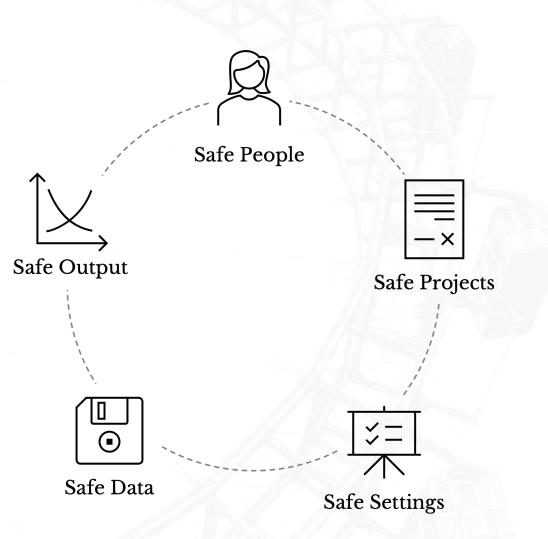
Resources

- <u>https://dbrepo.ossdip.at</u> (sandbox)
- https://dbrepo-docs.ossdip.at (documentation, getting started guide)
- <u>https://gitlab.phaidra.org/fair-data-austria-db-repository/fda-services</u> (source code)



"five safes" dimensions:

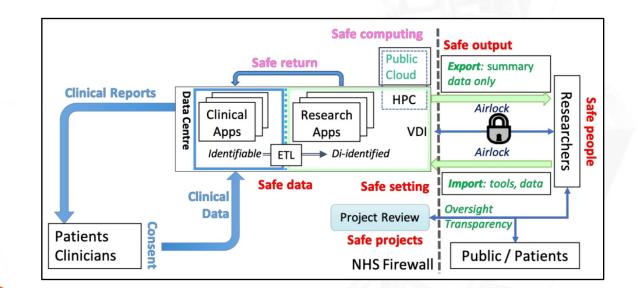
- 1. Safe projects, appropriateness of the usage of the data
- 2. Safe people, identify users that access senstive data, legal bindings
- *3. Safe data*, **appropriate** data deidentification, research questions formulated
- 4. Safe settings, necessity of security and transparency
- 5. Safe outputs, approved, aggregated research results can be exported



Desai, T., 2016. Five Safes: Designing Data Access for Research. [Online]. URL: <u>https://uwe-repository.worktribe.com/output/914745/five-safes-designing-data-access-for-research</u>, accessed 2022-09-10 Martin Weise, Technical University of Vienna



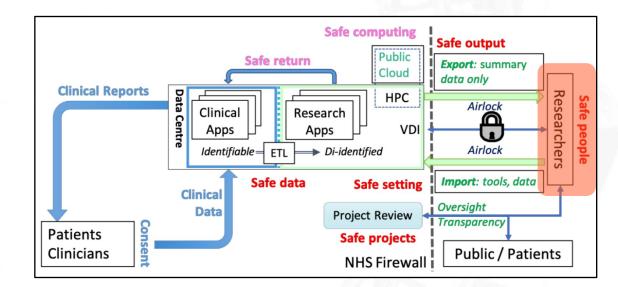
- United Kingdom Health Data Research Alliance (UKHDRA)
- Confederation of leading organizations in the healthcare field
- Extend "five safes"
 - 6. Safe return, allow de-identified research results to be re-identified and securely mapped back to the original data set



Ensure public trust by implementing UKHDRA's recommendations on TRE+ and independent accreditation and audit

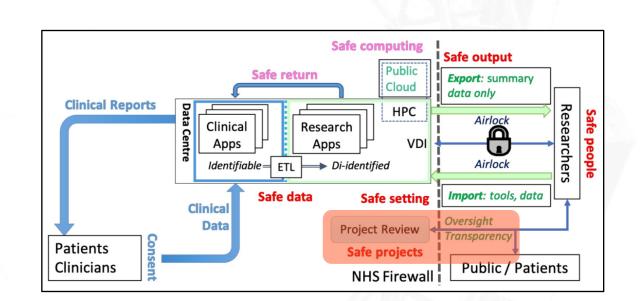


- 1. Safe people
 - Control & ensure interests of people where data
 - Collected
 - Analyzed
 - Sign legally-binding documents (e.g. NDAs)
 - Analysts must undergo information governance training (once approved, access all)



UK Health Data Research Alliance

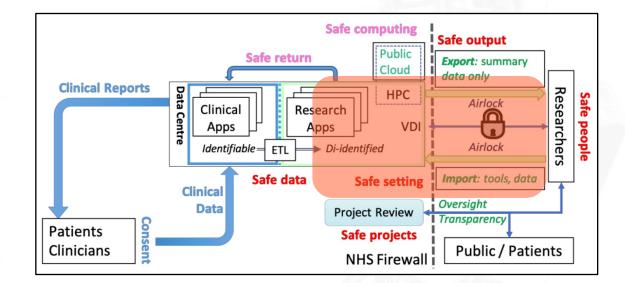
- 2. Safe projects
 - Appropriate use of sensitive data
 - Mandatory possibility to external audits
 - Ethics board (review the project proposal and gives a clearance)
 - Want to **improve the maturity** of the project management processes



UK Health Data Research Alliance

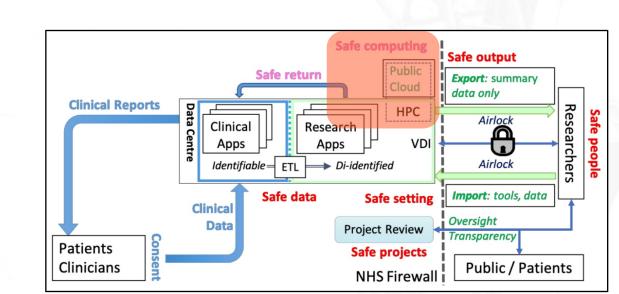
3. Safe setting

- Ensure a straightforward to use, secure environment for the sensitive data to reside in
- Defined and transparent process
- Trusted administrators with permission to exchange data through the air-gap
- System-internal barriers
- Protected individual data cannot be exported
- Actions of authorized analysts are monitored





- 4. Safe computing
 - Outsourcing infrastructure (e.g. content delivery networks)
 - Overcome the risk of exposing sensitive data to public cloud providers
 - Additional safeguards that disallow any outsourced hardware or software
 - Access the sensitive data at any time must be implemented
 - This approach is well-studied and supported from major public cloud providers.

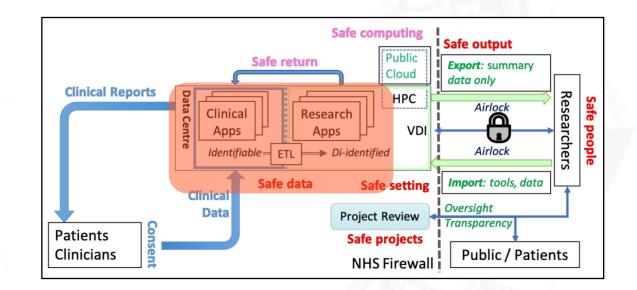


UK Health Data Research Alliance



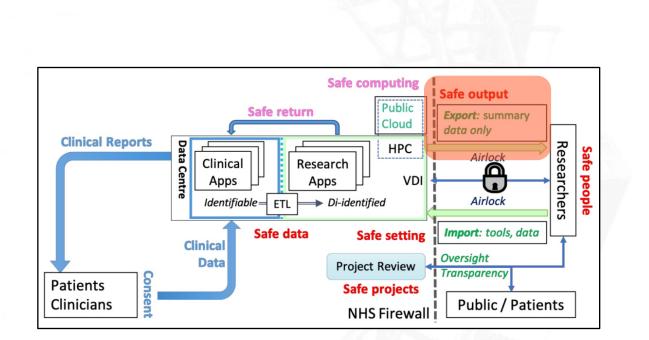
5. Safe data

- Minimize risk of (accidental) reidentification of protected individuals when importing data into the TRE
- De-identification software tools and encrypted (virtual) disks
- Prioritizes the interests of the protected individual over the analyst through technical & organizational measures





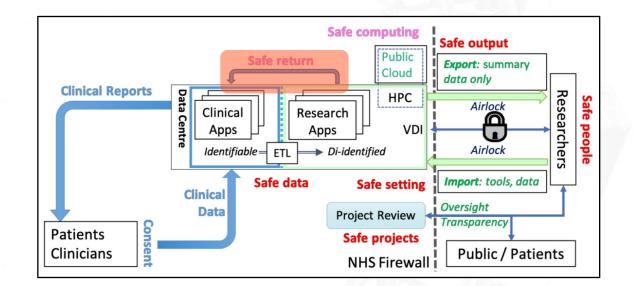
- Barrier ("air-gap") of the safe setting and the open internet
- Data Ingress/egress process
 - Manual interaction to control risk of disclosure
- Manages the communication to the outside world



UK Health Data Research Alliance

7. Safe return

- De-identified research output to be returned into the TRE where the sensitive data comes from and the identity of the protected individual is known
- Gain information about the protected individual itself
- Profit from allowing analysts to work with the data
- Researchers can only access deidentified sensitive data while all their actions are overseen by a committee



Upon approval of both the patient and the ethics board, the research output can be re-identified and mapped back to the original data set to enrich value to it.

4.1. RemoteNEPS

NEPS



National Education Panel Study (NEPS)

- Remote access to data to utilize them better than local access
- Better than conventional methods
 - Remote execution
 - Job-submission systems
- Hosts a full-fledged secure data infrastructure
- Data access is **moderately** anonymized, the Analyst must sign an additional supplementary agreement

Queues, input-output (heavily) delayed

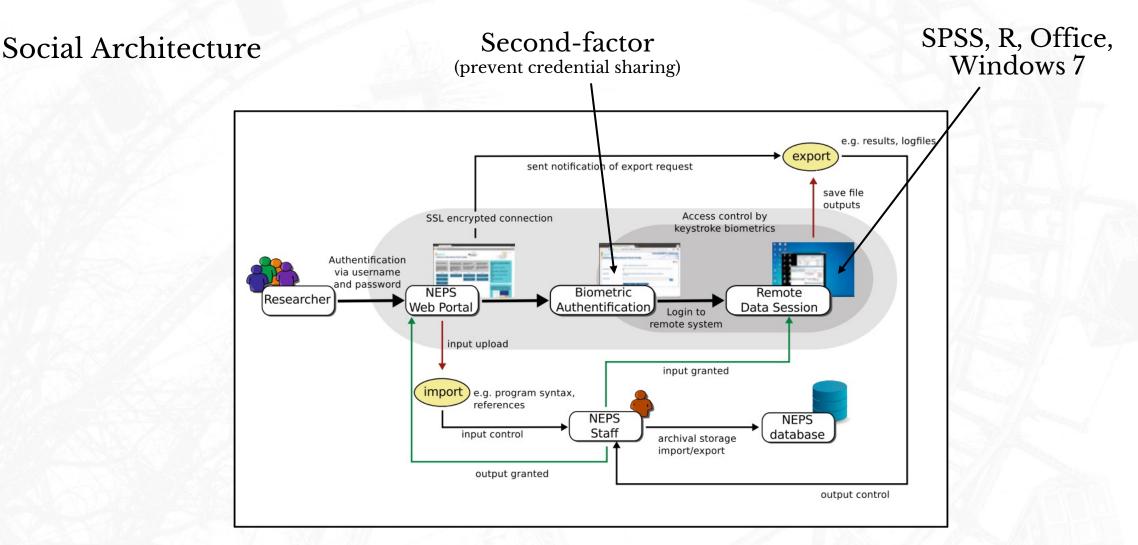
- Data export is possible via link after signing data us agreements (heavily anonymized and aggregated)

Skopek, J., 2016. RemoteNEPS - An Innovative Research Environment, in Methodological Issues of Longitudinal Surveys: The Example of the National Educational Panel Study, p.611-626. DOI: 10.1007/978-3-658-11994-2 34

4.1. RemoteNEPS

NEPS





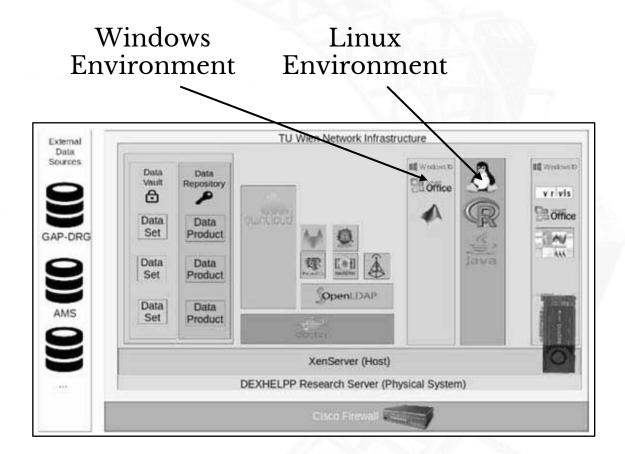
Skopek, J., 2016. RemoteNEPS - An Innovative Research Environment, in *Methodological Issues of Longitudinal Surveys: The Example of the National Educational Panel Study*, p.611-626. DOI: 10.1007/978-3-658-11994-2 34

4.2. DEXHELPP



Facilitates research in Austria for almost 10 years

- Provide analysts with a secure and controlled environment without the need to exfiltrate data out of the system
- Data owners on the other side deposit their data from heterogeneous sources in an encrypted vault and specify finegrained access rights, e.g.
 - Entire data assets
 - Just specific subsets



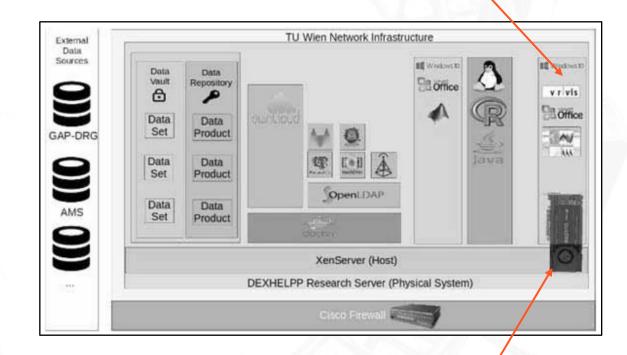
Popper, N., 2017. Planning Future Health: Developing Big Data and System Modelling Pipelines for Health System Research, in Simulation Notes Europe, 27(4), p.203-208 2017. DOI: 10.11128/sne.27.tn.10396 Martin Weise, Technical University of Vienna

4.2. DEXHELPP



- Monitoring Node continuously monitors the access to the Data Endpoint (allows for auditing and inspection of the usage of the data at any time)
- Docker environment (e.g. PostgreSQL, RStudio, Web Applications)
- Analysts **working** on the Remote Desktop Node, connected through the VPN Client using two-factors
- Special hardware and hypervisor for GPU execution

Accelerated Environment

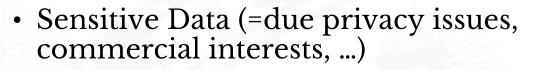


Special Hardware

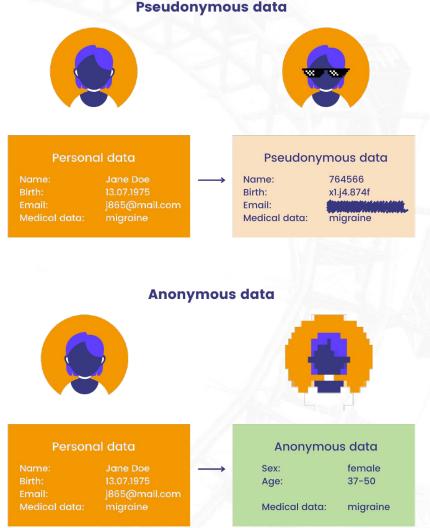
Popper, N., 2017. Planning Future Health: Developing Big Data and System Modelling Pipelines for Health System Research, in Simulation Notes Europe, 27(4), p.203-208 2017. DOI: 10.11128/sne.27.tn.10396 Martin Weise, Technical University of Vienna



Pseudonymous data



- Provide access for analysis, but ensure data is not leaked or misused
- Standard approach
 - Pseudonymization
 - Anonymization
 - k-anonymity
 - *l*-diversity
 - *t*-closeness





- Sensitive Data (=due privacy issues, commercial interests, ...)
- Provide access for analysis, but ensure data is not leaked or misused
- Standard approach
 - Pseudonymization
 - Anonymization
 - k-anonymity
 - *l*-diversity
 - *t*-closeness

Alice knows Bob is 27yo, lives in 47678 and is in the first three entries

⊆ Bob has a heart diseaese

sensitive attribute

	ZIP Code	Age	Disease
1	47677	29	Heart Disease
2	47602	22	Heart Disease
3	47678	27	Heart Disease
4	47905	43	Flu
5	47909	52	Heart Disease
6	47906	47	Cancer
7	47605	30	Heart Disease
8	47673	36	Cancer
9	47607	32	Cancer

3-anonymity

	ZIP Code	Age	Disease
1	476**	2*	Heart Disease
2	476**	2*	Heart Disease
3	476**	2*	Heart Disease
4	4790*	≥ 40	Flu
5	4790*	≥ 40	Heart Disease
6	4790*	≥ 40	Cancer
7	476**	3*	Heart Disease
8	476**	3*	Cancer
9	476**	3*	Cancer

Samarati, P., 2001. Protecting Respondents Identities in Microdata Release, in *IEEE Transactions on Knowledge and Data Engineering*, 13(6). DOI: <u>10.1109/69.971193</u> Martin Weise, Technical University of Vienna



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- Provide access for analysis, but ensure data is not leaked or misused
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 - *l*-diversity
 - *t*-closeness

Alice knows Bob is 27yo, lives in 47678 and is in the first three entries

⊆ Bob has a low salary and some stomach disease

sensitive attributes

	ZIP Code	Age	Salary	Disease
1	47677	29	3K	gastric ulcer
2	47602	22	4K	gastritis
3	47678	27	5K	stomach cancer
4	47905	43	6K	gastritis
5	47909	52	11K	flu
6	47906	47	8K	bronchitis
7	47605	30	7K	bronchitis
8	47673	36	9K	pneumonia
9	47607	32	10K	stomach cancer

3-diverse

	ZIP Code	Age	Salary	Disease	
1	476**	2*	3K	gastric ulcer	
2	476**	2*	4K	gastritis	
3	476**	2*	5K	stomach cancer	
4	4790*	≥ 40	6K	gastritis	
5	4790*	≥ 40	11K	flu	
6	4790*	≥ 40	8K	bronchitis	
7	476**	3*	7K	bronchitis	
8	476**	3*	9K	pneumonia	
9	476**	3*	10K	stomach cancer	

Machanavajjhala, A., et al 2006. L-diversity: Privacy Beyond k-anonymity, in *Proceedings of the 22nd International Conference on Data Engineering*. DOI: <u>10.1109/ICDE.2006.1</u> Martin Weise, Technical University of Vienna



- Sensitive Data (=due privacy issues, commercial interests, ...)
- Provide access for analysis, but ensure data is not leaked or misused
- Standard approach
 - Pseudonymization
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Alice knows Bob is 27yo, lives in 47678 and is in the first three entries

 \subseteq **Bob** has a ???

sensitive attributes

	ZIP Code	Age	Salary	Disease
1	47677	29	3K	gastric ulcer
2	47602	22	4K	gastritis
3	47678	27	5K	stomach cancer
4	47905	43	6K	gastritis
5	47909	52	11K	flu
6	47906	47	8K	bronchitis
7	47605	30	7K	bronchitis
8	47673	36	9K	pneumonia
9	47607	32	10K	stomach cancer

0.167-closeness (Salary) 0.278-closeness (Disease)

	ZIP Code	Age	Salary	Disease
1	4767*	≤ 40	3K	gastric ulcer
3	4767*	≤ 40	5K	stomach cancer
8	4767*	≤ 40	9K	pneumonia
4	4790*	≥ 40	6K	gastritis
5	4790*	≥ 40	11K	flu
6	4790*	≥ 40	8K	bronchitis
2	4760*	≤ 40	4K	gastritis
7	4760*	≤ 40	7K	bronchitis
9	4760*	≤ 40	10K	stomach cancer

Ninghui, L., et al, 2007. t-Closeness: Privacy Beyond k-Anonymity and l-Diversity, in *Proceedings of the 23rd International Conference on Data Engineering*. DOI: <u>10.1109/ICDE.2007.367856</u> Martin Weise, Technical University of Vienna





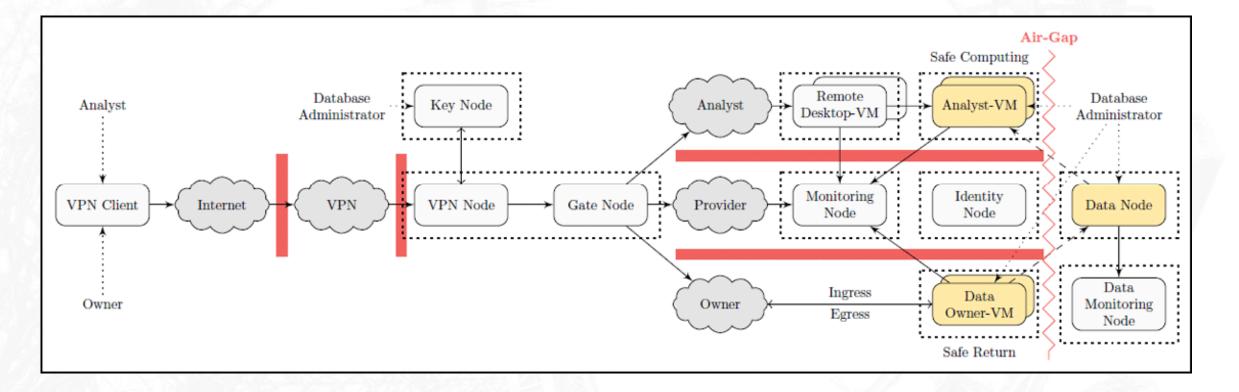
- Data Owner maintains full control over data and use:
 - Who to allow access,
- Over which period of time,
- For which subset of data,
- To answer which research question / analysis goals,
- While monitoring what they are doing
- Based on experience of operating DEXHELPP for nearly 10 years







Technical Architecture:



Weise, M., et al, 2022. OSSDIP: Open Source Secure Data Infrastructure and Processes Supporting Data Visiting, in *Data Science Journal*, 21(1). DOI: <u>10.5334/dsj-2022-004</u> Martin Weise, Technical University of Vienna

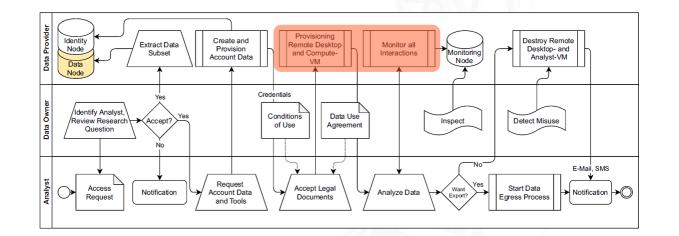




(highlight)

- 1. Researcher sends **request** to Data Owner (*Person, question, required data*)
- 2. Granted: subset of data, at specific aggregation level, potentially with fingerprint is extracted onto a VM for a dedicated researcher for a dedicated time period to address the question posed
- 3. Expose metadata of data subsets (FAIRness)
- 4.
- 5. Provisioning of VNC and Compute VMs with dedicated software and data

Weise, M., et al, 2022. OSSDIP: Open Source Secure Data Infrastructure and Processes Supporting Data Visiting, in *Data Science Journal*, 21(1). DOI: <u>10.5334/dsj-2022-004</u> Martin Weise, Technical University of Vienna



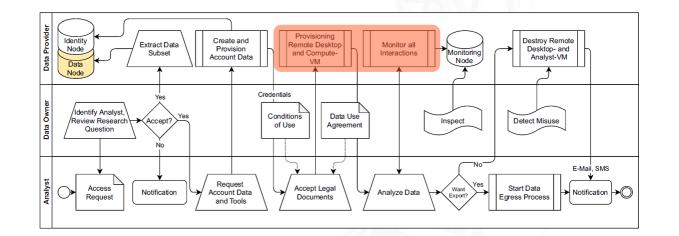




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4.3. OSSDIP Further Reading

TU WIE

Material

- <u>https://doi.org/10.5334/dsj-2022-004</u> (journal paper)
- <u>https://doi.org/10.34726/hss.2022.84700</u> (master's thesis)
- https://doi.org/10.17605/OSF.IO/VKN4R (iPRES'21 paper)

Resources

- <u>https://ossdip.at/</u> (documentation, getting started guide)
- <u>https://gitlab.tuwien.ac.at/martin.weise/ossdip</u> (source code)

5. Future Work



DBRepo

- Prepare for test phase Q1 2023
- Prepare for **rollout** phase Q1 2024
- Document all endpoints, methods, files, readme, changelog, etc.
- Implement OAI-PMH interface for metadata harvesting

OSSDIP

- Find (friendly) test-users that want to deploy it within their premises using **synthetic** data
- Implement DBRepo features to make sensitive data **findable** and **reusable** (<u>FAIR</u>)
- Transform into Virtual Research Environment (e.g. integrating Jupyterhub, Collaborative chat)
- HPC

6. Conclusion



Different Repositories

- Must support a wide range of research objects
- Provide good visibility to them
- Will be a place where research happens

Trusted Research Environments

- Traditional privacy methods not sufficient for exploratory research
- Virtual meeting points to work with sensitive data and known tools
- Organizational / Technical / Legal

Composition of systems needed

- Gradual development with increasing complexity
- Integration and automation are key to facilitate adoption

Repositories and TREs are as trustworthy as their institutions

Contact



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