

From Data Chaos to Data Harmony: Managing NGS Data in a Wet Lab

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DeIC conference 2023-11-08



Agenda

About

Intro

The problem

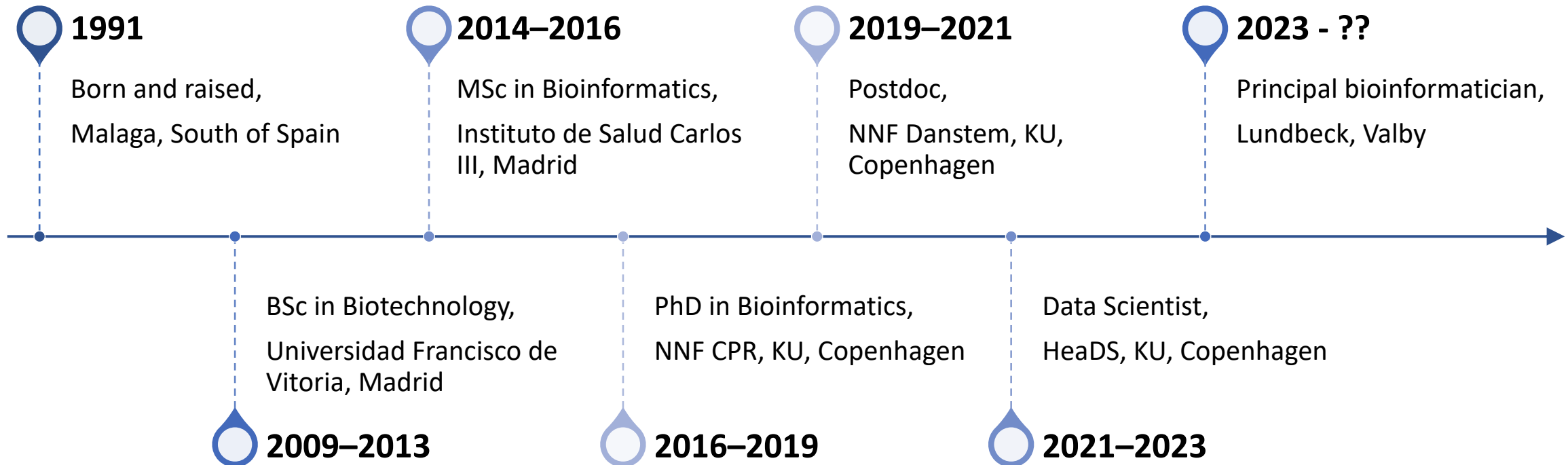
Simple solutions

Future work

Acknowledgments



About me



About HeaDS

- Center for Health Data Science, KU
 - Strengthen health data science at KU
 - Serve as a hub for researchers
 - Provides consulting services
 - Teaching in various topics

- Working for the Sandbox project
 - Multi-disciplinary
 - Multi-institutional
 - Virtual Environment for Health Data Science



Anders Krogh



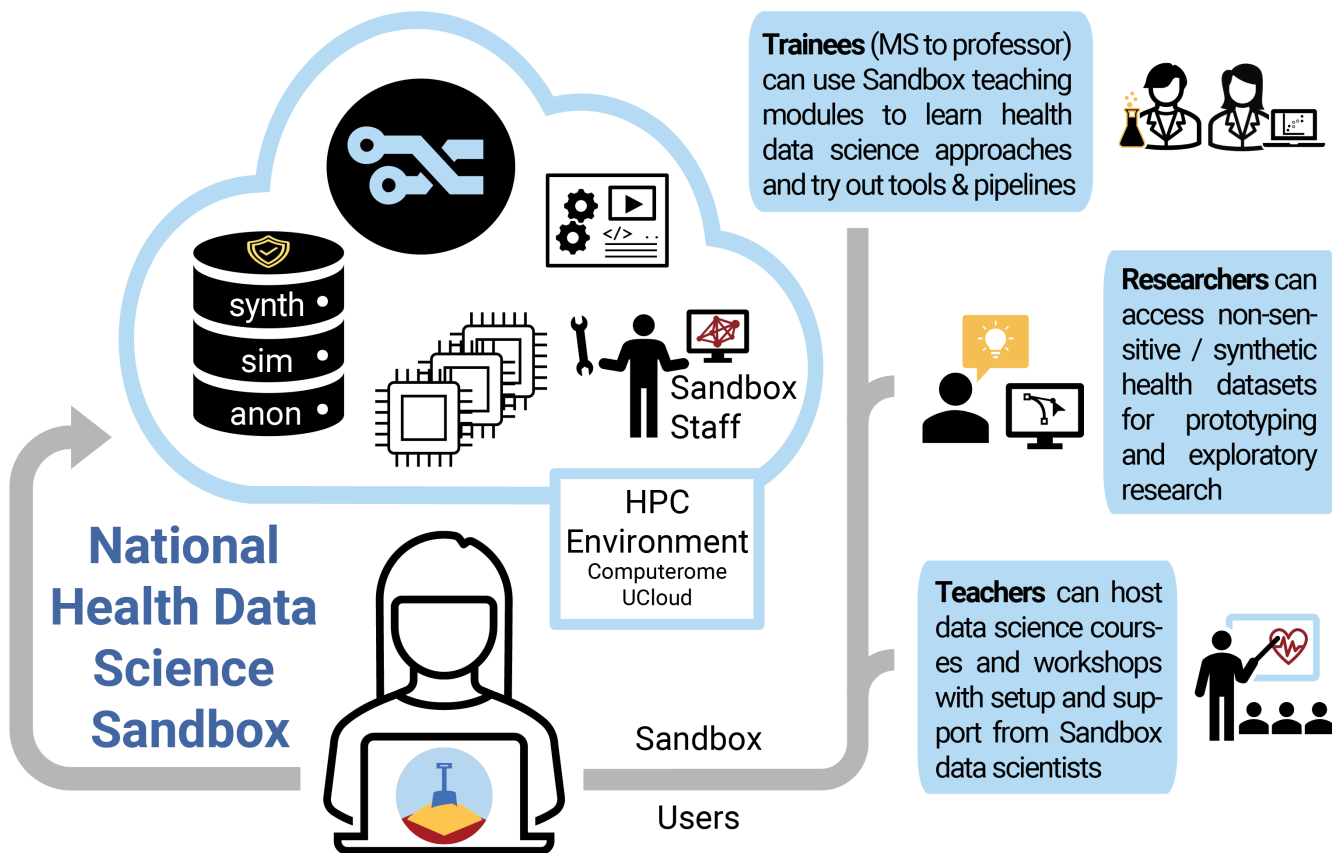
Jennifer Bartell



HeaDS



About Sandbox



Aarhus University
Genomics

Southern Denmark University
Proteomics

Copenhagen University
Transcriptomics

Denmark DTU
Supercomputing

Aalborg University
Health records
& predictive modeling

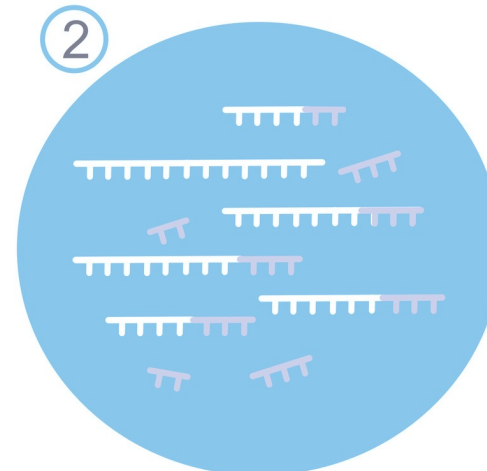


NGS data

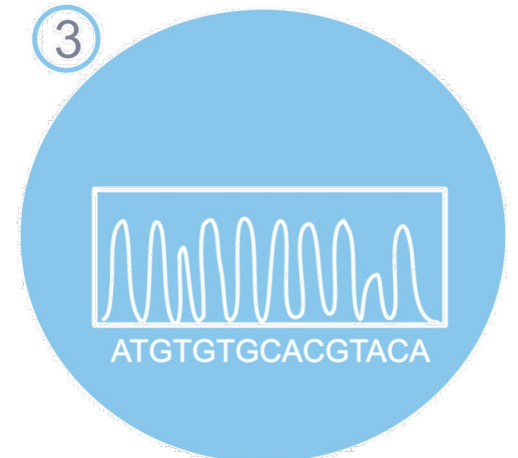
- Next Generation Sequencing Data
 - Determine genetic information
- Applications:
 - Genomic research
 - personalized medicine
 - forensic science, and more
- Millions of DNA sequences generated
 - Really big datasets (Gb per sample)



Extraction



Library



Sequencing

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RDM for wet lab

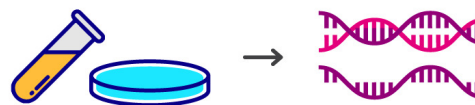
- RDM supported options
 - ELNs and LIMS
- Tracks:
 - Experiments, protocols, samples
 - Order of chemicals
 - Instruments and physical storage

- **Bioinformatics data and its analysis is not tracked at all!**

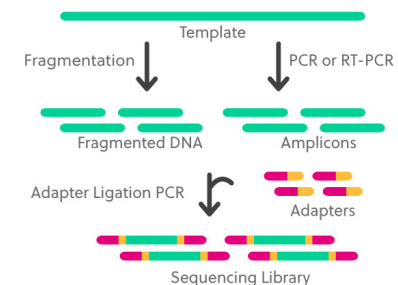
Labguru

 Benchling

STEP 1:
Extraction



STEP 2:
Library
Prep



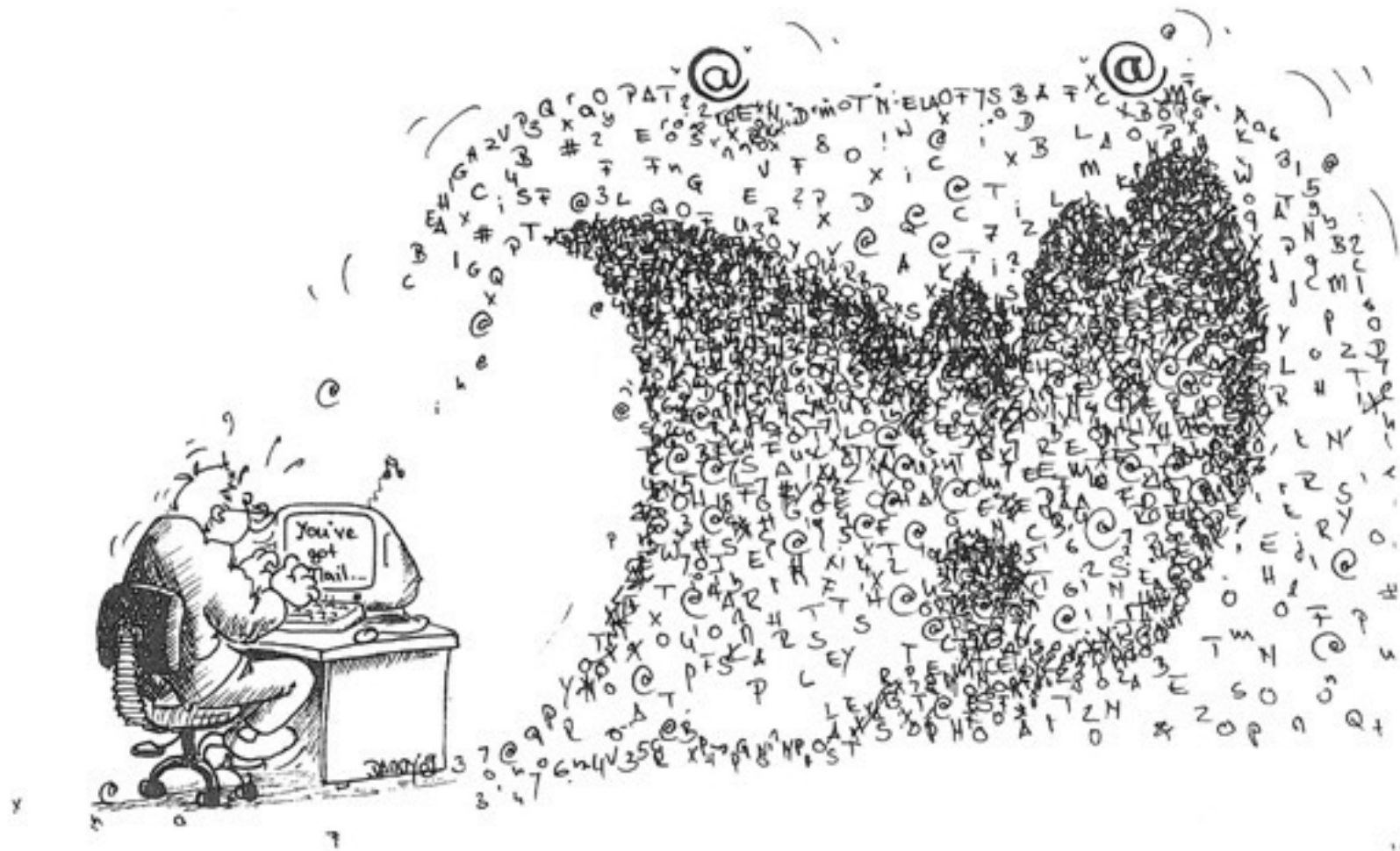
STEP 3:
Sequencing



STEP 4:
Analysis



Bioinformatics in a wet lab



Data chaos

- Data accumulated for several years
- No common structure
- No common file naming conventions
- No metadata or documentation
- No provenance
- Massive problems when staff leaves

Digital version of a chaotic desktop



Wonderlane on Unsplash



Data chaos

Me, myself and only I to blame

The image shows a screenshot of a file explorer window displaying a directory structure. The 'images' folder is highlighted in blue. The directory structure is as follows:

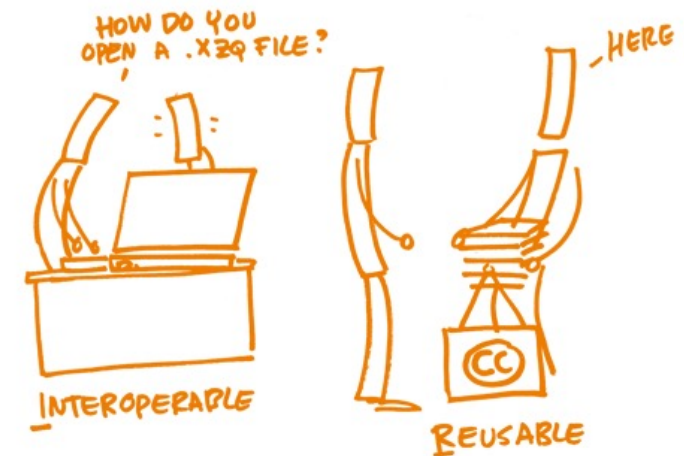
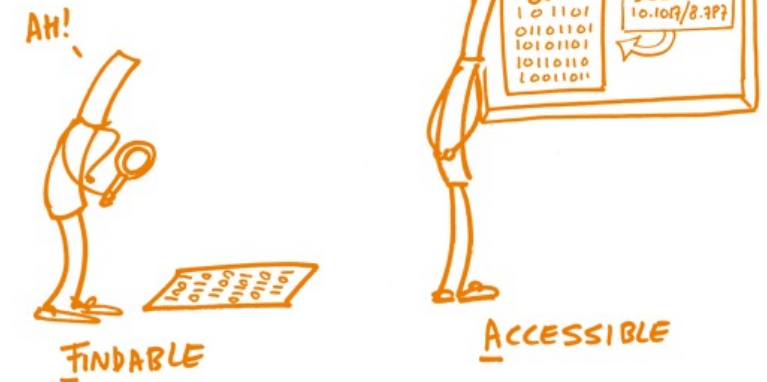
- compass
- data_simula...n_modeling
- datathon_diabetes
- diet_diabetes
- food_chemicals
- heart_CAG
- infertility
- lipidomics
- 441977_Onli...5_JARH.pdf
- Circos
 - Cytoscape
 - data
 - documents
 - old
 - papers
 - plots
 - R_data
 - rules_extra_information
 - scripts
 - semen_quality_paper
 - tests
 - common_b...ty1_AKB.xlsx
 - common_b...ty2_AKB.xlsx
 - common_b...ty3_AKB.xlsx
 - common_fe...y1_AKB.xlsx
 - common_fe...y2_AKB.xlsx
 - common_in...y1_AKB.xlsx
 - common_in...y2_AKB.xlsx
 - common_in...y3_AKB.xlsx
 - Variables_o...es_AKB.xlsx
 - Common rul...le men.docx
 - infertiltv compass.RData
- anUCS_1
 - common
 - common_both
 - common_fertile
 - common_infertile
 - new_plots
 - nordic8
 - nordic8_phenotype
 - nordic9
 - nordic9_blank
 - nordic9_blank_groups
 - nordic9_bla...shape18x18
 - nordic9_phenotype
 - old_plots
 - test
 - test_both
 - test_both_v2
 - test_both_v3
 - test_infertile
 - test_infertile_v2
 - test_v2
 - Nature_insp...n_circos.jpg
 - rules_both.xlsx
- data
- etc
- images
 - anUCS_1_1.conf
 - anUCS_1_2.conf
 - anUCS_1_3.conf
 - anUCS_1_4.conf
 - anUCS_1_5.conf
 - anUCS_1_c...t.e12987406
 - anUCS_1_c...t.e12988941
 - anUCS_1_c...t.o12987406
 - anUCS_1_c...t.o12988941
 - anUCS_1.e12987371
 - anUCS_1.e12987441
 - anUCS_1.e12988906
 - anUCS_1.o12987371
 - anUCS_1.o12987441
 - anUCS_1.o12988906
 - END
 - anUCS_1_sample_list.txt
- anUCS_1_convert.error
- anUCS_1_convert.out
- anUCS_1.error
- anUCS_1.out
- anUCS_1_U...00071_1.pdf
- anUCS_1_U...00071_2.pdf
- anUCS_1_U...00071_3.pdf
- anUCS_1_U...00071_4.pdf
- anUCS_1_U...00071_5.pdf
- anUCS_1_U...71_total.pdf
- anUCS_1_U...00071_1.png
- anUCS_1_U...0071_2.png
- anUCS_1_U...0071_3.png
- anUCS_1_U...0071_4.png
- anUCS_1_U...00071_5.png



Solution: FAIR principles

- Many guidelines on FAIR principles
- Not much applied to NGS data
 - Some few examples, but not applications
- Simple guidelines for any bioinformatician
 - Basic command line experience
 - Version control with git/GitHub

FAIR DATA PRINCIPLES



Simple rules for NGS RDM

1. Adhere to **folder structures** and **naming conventions** using **templates**
2. Fill a **DMP template** that it is **prefilled** with common information
3. Create and fill **metadata file** and **README file** in each folder
4. Make a **browsable database** from all metadata files
5. Use **community-curated workflows** for data preprocessing
6. **Version control** data analysis with git/Github
7. Display **data analysis reports** with GitHub Pages
8. **Archive** data and data analysis in **repositories** (Zenodo-GEO/Annotare)



1. Folder templates and naming conventions

- Create custom templates using
 - Very flexible
 - Simple, but can do complex things
- Command line utility
 - Assay folders: NGS data
 - *Project* folders: Data analyses



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1. Folder templates and naming conventions

Data folder (“assays”)

- Subfolders → NGS experiment data
- Read only, no duplicates
- Unique ID, human readable
- Metadata file
 - ID, keywords, tech, author, date, etc.
 - Controlled vocabularies
- README.md: additional details
- Data organization:
 - raw, processed, pipeline
 - pipeline: community curated workflows

```
(ngs)
sarahlu at sarahlu-ThinkPad-T14-Gen-2i in ~/Documents
$ tree RNA_20230628
RNA_20230628
├── checklist.md
├── description.yml
├── metadata.yml
├── pipeline.md
├── processed
│   ├── bam
│   ├── bed
│   └── counts
├── raw
│   ├── fastq
│   └── samplesheet.csv
└──
```

6 directories, 5 files



1. Folder templates and naming conventions

Project folder (“projects”)

- Subfolders → research project
- Simlink multiple Assays, no copies!
- Version controlled
- ID: AUTHOR_DESC_YYYYMMDD
- Metadata and README file
- Folder organization:
 - data, notebooks, reports, scripts, results, docs
- Naming conventions for results and figures
 - Heatmap_DEA_TreatVsControl_YYYYMMDD.tiff

```
sarahlu at sarahlu-ThinkPad-T14-Gen-21 in ~/Documents/Lundregan_RNAex
$ tree
.
├── data
│   ├── assays
│   │   └── RNA_20230628 -> /home/sarahlu/Documents/RNA_20230628
│   └── processed
├── documents
│   ├── Hamilton_etal_2019_Nature.pdf
│   └── project_overview.docx
├── notebooks
│   ├── 01_preprocessing.qmd
│   └── 02_differential_expression.qmd
├── _quarto.yml
├── README.md
├── reports
│   ├── 01_preprocessing_files
│   │   └── figure-html
│   │       ├── fig-01_model_fit.png
│   │       └── fig-01_PCA.png
│   ├── 01_preprocessing.html
│   ├── 02_differential_expression_files
│   │   └── figure-html
│   │       ├── fig-02_heatmap_0h_vs_2h.png
│   │       └── fig-02_volcano_0h_vs_2h.png
│   ├── 02_differential_expression.html
│   ├── index.html
│   ├── README.html
│   └── search.json
```



2. Prefilled DMP template

- Prefilled with repetitive info
 - GEO, Github, Labguru...
 - Metadata and standards used
 - How it adheres to FAIR
- Streamline the process of writing your DMP
- Shared publicly
- More templates can be created depending on data
 - Sensitive datasets
 - Imaging data
 - Other omics data



Non-sensitive NGS research project template

A screenshot of the DMP ONLINE web interface. At the top, there are navigation tabs: 'Project Details', 'Plan overview', 'Write Plan' (which is active), 'Share', and 'Download'. Below the tabs, there are links for 'expand all' and 'collapse all', and a progress indicator showing '32/41 answered'. The main content area displays a list of sections with expand/collapse icons: '1. Data Summary (6 / 6)', '2. FAIR data (24 / 24)', and '3. Other research outputs (2 / 2)'.

Project Details	Plan overview	Write Plan	Share	Download
expand all collapse all				
32/41 answered				
1. Data Summary (6 / 6)				+
2. FAIR data (24 / 24)				+
3. Other research outputs (2 / 2)				+



3. Metadata and README

- Cookiecutter template will require you to fill metadata fields
- Collected metadata will be saved in a metadata.yml file
- Short descriptions in README.txt

Metadata field	Convention	Example
assay_type	-	ChIP-seq
owner	<Initials>	JARH
creation_date	<YYYYMMDD>	20231108
platform	-	Illumina
organism	<Genus species>	Homo sapiens
nsamples	<integer>	9

```
# NGS Analysis Project: Exploring Gene Expression in Human Tissues
```

```
## Aims
```

```
This project aims to investigate gene expression patterns across various human tissues using Next Generation Sequencing (NGS) data. By analyzing the transcriptomes of different tissues, we seek to uncover tissue-specific gene expression profiles and identify potential markers associated with specific biological functions or diseases.
```



4. Browsable database

- Collect metadata files
- Create a tsv or SQL database
- Browse it with Shiny R app
- Very useful for all lab members

Brickman Lab - NGS Catalogue

owner: Annika Charlotte Sell, Madeleine Linneberg-Agerholm, Marta Perera Perez, Robert Alexander Bone

organism: mouse

short_desc: Enter key word...

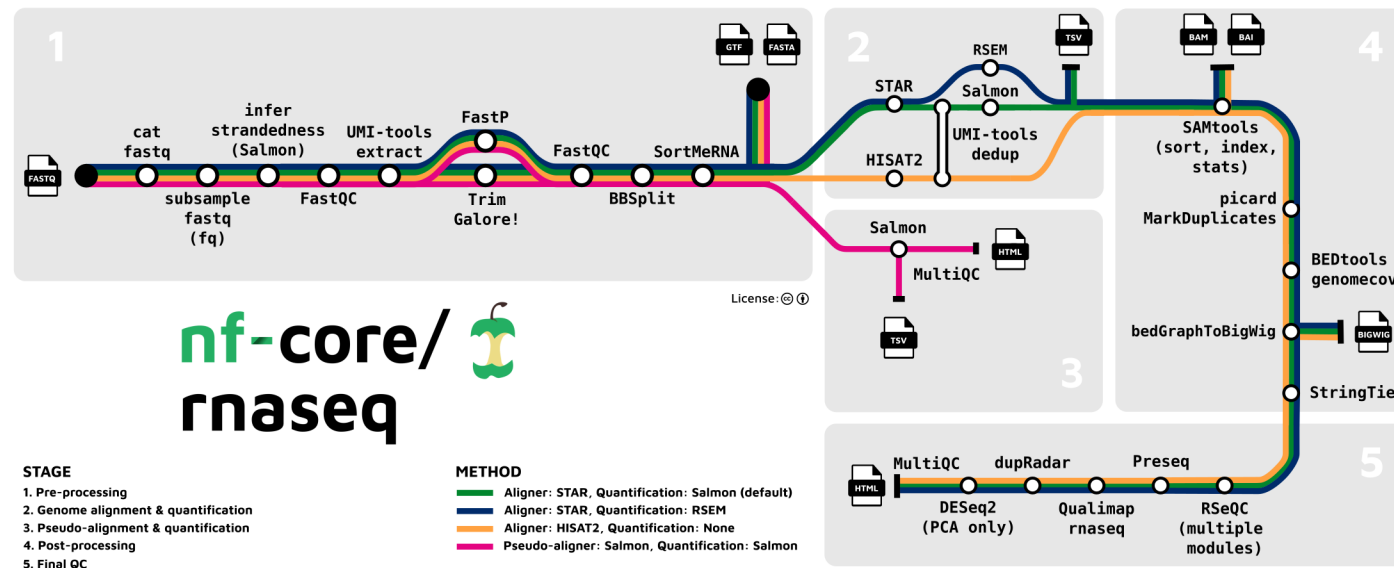
	assay_id	owner	date	codename	organism	short_desc
0	CHIP_20220804	Annika Charlotte Sell	2022-08-04	Mbd3_CHIPseq	mouse	Double fixation CHIP-seq for Mbd3 in 0h and 2h Erk
1	CAT_20221024	Madeleine Linneberg-Agerholm	2022-10-24	oct4_cutandtag	mouse	OCT4 and PDGFRA expression in nEnd subpopulations
2	RNA_20230526	Marta Perera Perez	2023-05-26	ERK_context_dependency	mouse	cRAF mouse E3.5 and E5.5 epiblast, 4h vs 0h Erk induction
3	CHIP_20230425	Annika Charlotte Sell	2023-04-25	Sall4_CHIPseq	mouse	Double fixation CHIP-seq for Sall4 in 0h and 2h Erk
4	CAR_20210329	Annika Charlotte Sell	2021-03-29	Sall4_cut&run	mouse	Native cut&run for Sall4 in 0h and 2h Erk
5	SCR_20220209	Madeleine Linneberg-Agerholm	2022-02-09	NaN	mouse	scRNA-seq of mouse 2iLIF ESCs, naive extra-embryonic
6	CAT_20230531	Robert Alexander Bone	2023-05-31	cut&tag_mutant_sox2	mouse	cut&tag for WT and mutant Sox2
7	CROP_20230615	Rita Monteiro	2023-06-15	Internal codename	mouse	Cut&Run_CROP trial on factors in an ERK induction exper



5. Community-curated workflows



- A community effort to collect a curated set of analysis pipelines
- Uses **nextflow** language, specialized for reproducible workflows
- Many gold-standard bioinformatics and NGS pipelines



6. Version control data analysis



- Use version control framework for your data analysis: Git
 - NGS data is too big though
- Online repositories: GitHub
 - Create your lab organization
- Benefits
 - Enhance collaboration
 - Public sharing of the analysis of your data
 - Easier tracking of changes and results

A screenshot of a GitHub repository page for "Brickman Lab". The repository is titled "README.md" and is part of the "Brickman Group" organization. The page features a header with the "reNEW" logo (Steno Nordisk Foundation Center for Stem Cell Medicine) and a large image of a cell culture. Below the image, the text reads: "Transcriptional basis for cell fate choice". The description states: "The Brickman group aims to understand the transcriptional basis for early embryonic lineage specification. We are interested in the dynamic mechanisms by which cells can both reversible prime towards a particular fate or undergo a transition into commitment." The page also shows a "Publications" section. On the right side, there are statistics for the repository, including "3 followers", "Copenhagen", and social media links. The "Top languages" section lists Python, Jupyter Notebook, R, Shell, and HTML.



7. Data analysis reports

- Lab webpage using GitHub Pages
 - Intro to lab
 - Feature papers or data analyses
- Display your data analysis
 - Public after publication
 - Transparency of results and analysis
- Could be used as tool documentation



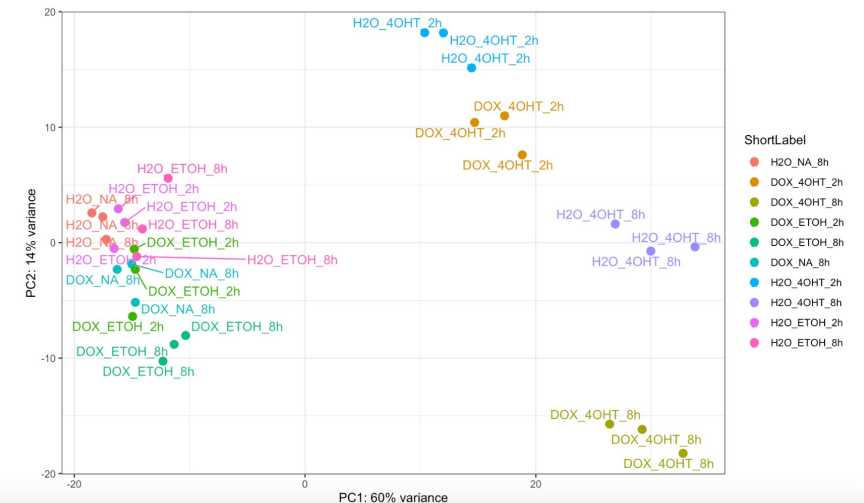
- 1 Introduction
- 2 Load packages
- 3 Load data
- 4 DESEQ pre-analysis
 - 4.1 Create DESEQ object
 - 4.2 Vst normalization
 - 4.2.1 Principal component plot of the samples
 - 4.2.2 Heatmap of the sample-to-sample distances
- 5 DE analysis
- 6 Save all results
- 7 Heatmaps
- 8 Josh's requests
- 9 Session info

4.2.1 Principal component plot of the samples

PCA plot using the first two components

```
pcaData <- plotPCA(vsd, intgroup=c("ShortLabel"), returnData=TRUE)  
percentVar <- round(100 * attr(pcaData, "percentVar"))
```

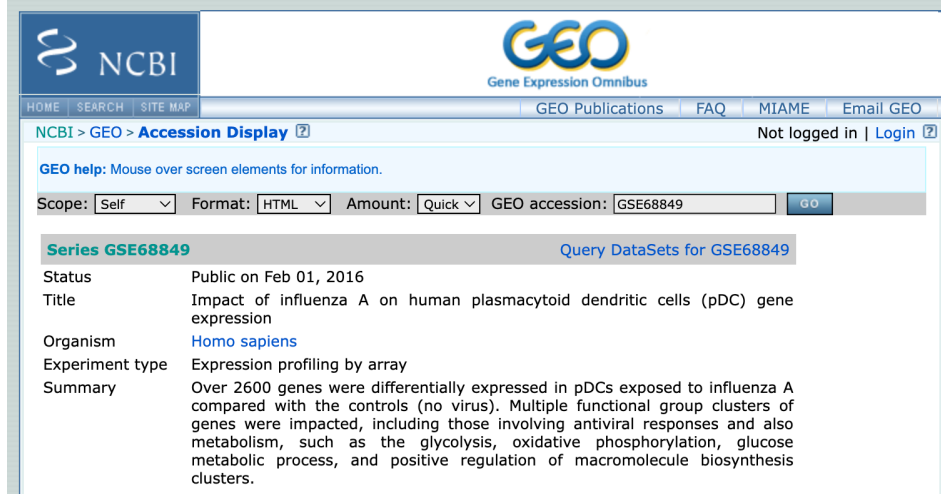
```
ggplot(pcaData, aes(PC1, PC2, color=ShortLabel, label=ShortLabel)) +  
  geom_point(size=3) + geom_text_repel() +  
  xlab(paste0("PC1: ", percentVar[1], "% variance")) +  
  ylab(paste0("PC2: ", percentVar[2], "% variance")) +  
  coord_fixed() + theme_bw()
```



8. Archiving

NGS data - Domain repository

- GEO or Annotare
- NGS metadata standards

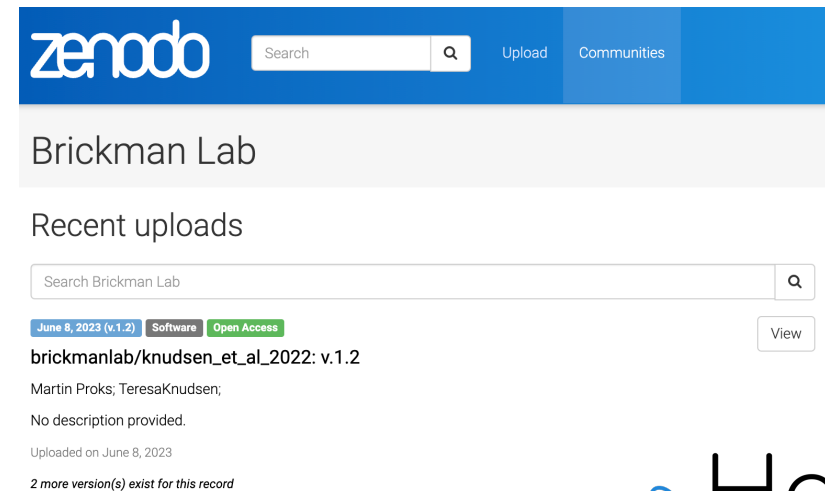


The screenshot shows the NCBI GEO Accession Display page for GSE68849. The page includes the NCBI logo, the GEO logo (Gene Expression Omnibus), and navigation links like HOME, SEARCH, and SITE MAP. The main content area displays the following information:

Status	Public on Feb 01, 2016
Title	Impact of influenza A on human plasmacytoid dendritic cells (pDC) gene expression
Organism	Homo sapiens
Experiment type	Expression profiling by array
Summary	Over 2600 genes were differentially expressed in pDCs exposed to influenza A compared with the controls (no virus). Multiple functional group clusters of genes were impacted, including those involving antiviral responses and also metabolism, such as the glycolysis, oxidative phosphorylation, glucose metabolic process, and positive regulation of macromolecule biosynthesis clusters.

Data analysis - Generic repository

- Zenodo
- DOI minting
- Synchronize with GitHub



The screenshot shows the Zenodo repository page for Brickman Lab. The page includes the Zenodo logo, a search bar, and navigation links like Upload and Communities. The main content area displays the following information:

Brickman Lab

Recent uploads

Search Brickman Lab

[June 8, 2023 \(v.1.2\)](#) [Software](#) [Open Access](#) [View](#)

brickmanlab/knudsen_et_al_2022: v.1.2

Martin Proks; TeresaKnudsen;

No description provided.

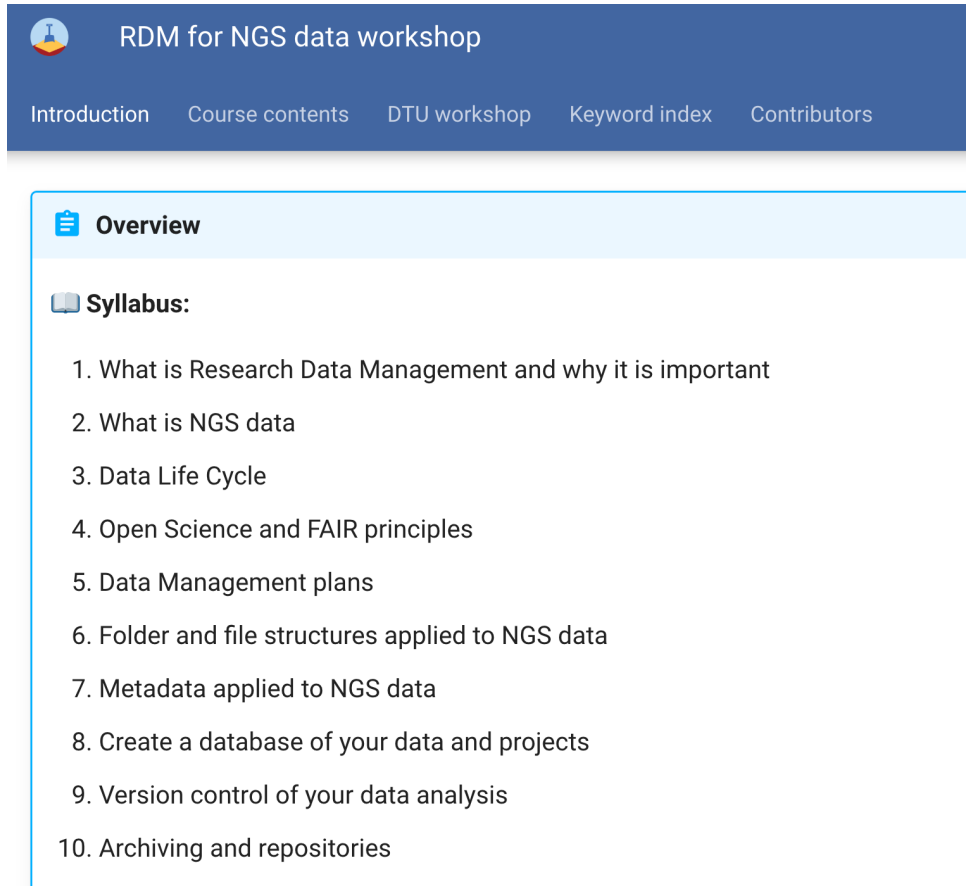
Uploaded on June 8, 2023

2 more version(s) exist for this record



Online course

https://hds-sandbox.github.io/RDM_NGS_course/



The screenshot shows the course page for 'RDM for NGS data workshop'. At the top, there is a dark blue header with the course title and a navigation menu containing 'Introduction', 'Course contents', 'DTU workshop', 'Keyword index', and 'Contributors'. Below the header, there is a light blue section titled 'Overview' with a clipboard icon. Underneath, a 'Syllabus:' section is listed with 10 numbered items.

RDM for NGS data workshop

Introduction Course contents DTU workshop Keyword index Contributors

Overview

Syllabus:

1. What is Research Data Management and why it is important
2. What is NGS data
3. Data Life Cycle
4. Open Science and FAIR principles
5. Data Management plans
6. Folder and file structures applied to NGS data
7. Metadata applied to NGS data
8. Create a database of your data and projects
9. Version control of your data analysis
10. Archiving and repositories



Future work

- Metadata ontologies and controlled vocabularies
 - Not easy to implement and enforce
 - Some examples are provided for different metadata fields
- Version control of the actual NGS data
- Need of command line experience and work for cookiecutter
 - Difficult for experimentalists
- Interaction between LIMS + ELN systems
 - Cross-linking data analysis with wet lab RDM
 - One place to go for everything?



Acknowledgements

Brickman lab



HeaDS center



Thank you!

