



## Towards reusable derived data in neuroimaging

Camille Maumet

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HAL Id: hal-04328352

<https://inria.hal.science/hal-04328352>

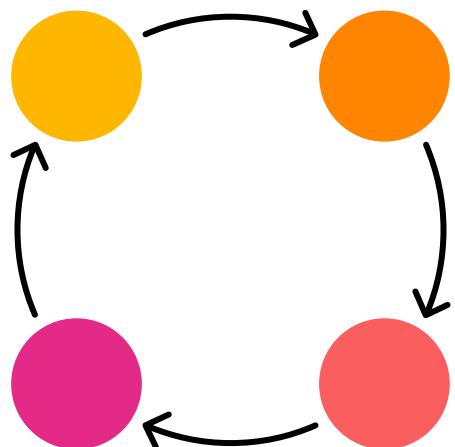
Submitted on 7 Dec 2023

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# Towards reusable derived data in neuroimaging

December 7, 2023

**Camille Maumet**

Inria, Univ Rennes, Inserm, CNRS, IRISA

# FAIR neuroimaging

Findable Accessible Interoperable Reusable



**Technical solutions:** Standards, Databases,  
Good practices (version control, etc.)

# FAIR neuroimaging

Findable Accessible Interoperable Reusable

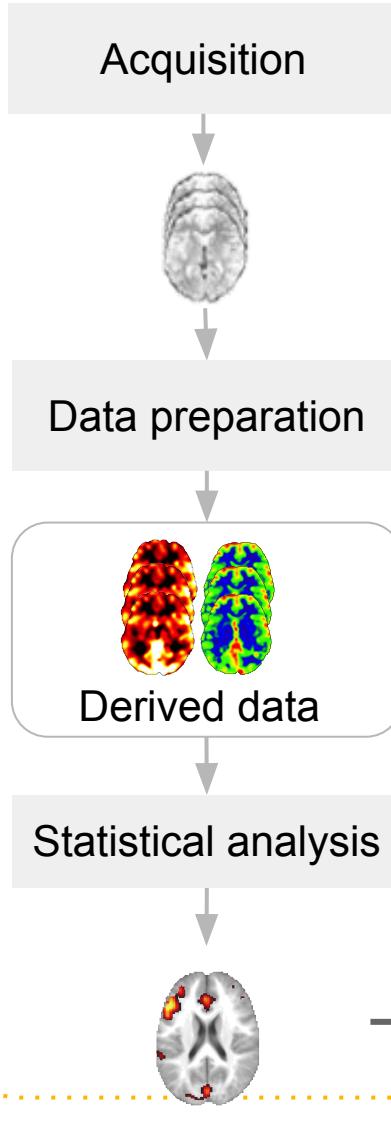


**Technical solutions:** Standards, Databases,  
Good practices (version control, etc.)

**A culture change: towards community-driven  
research**

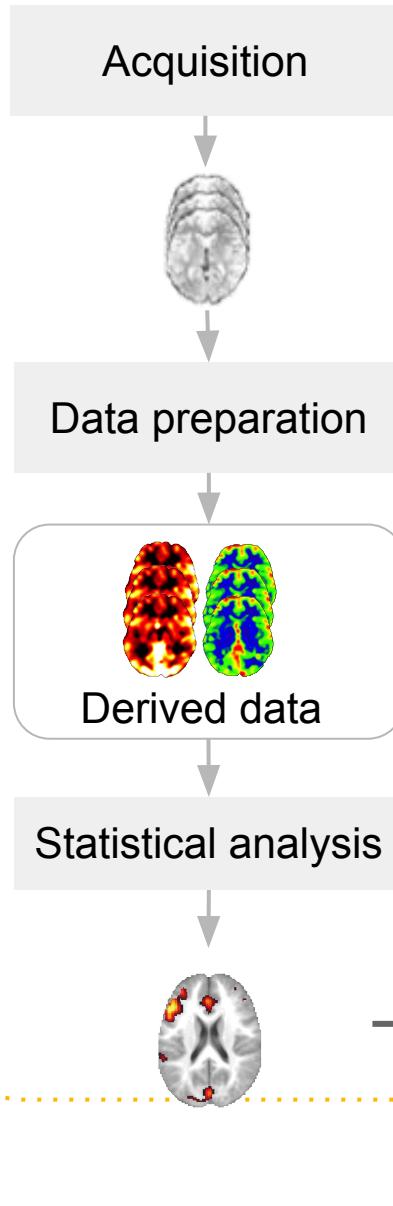
- Making resources **available to the scientific  
community**
- **Reusing** existing resources (datasets, tools) that  
were created by others

# Sharing FAIR research products



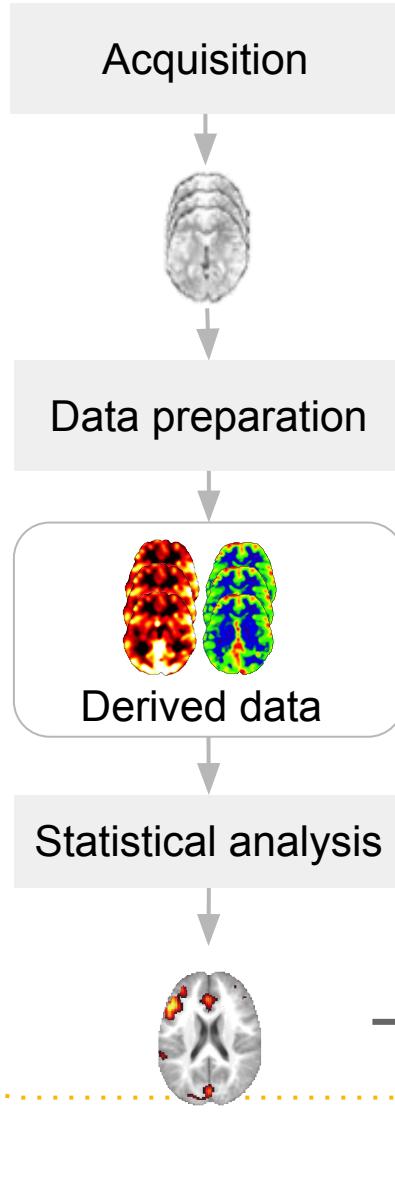
Credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).

# Sharing FAIR research products



Credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).

# Sharing FAIR research products

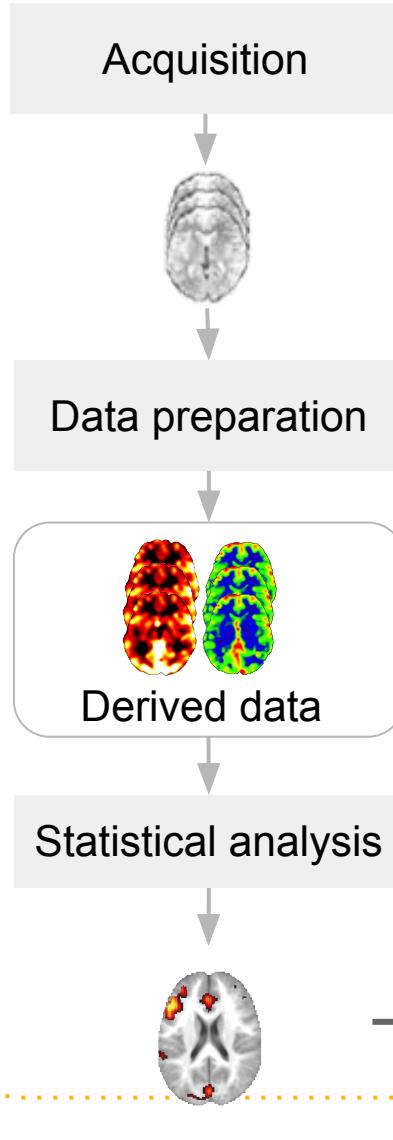


Biorxiv, arxiv,  
HAL,  
Pubmed

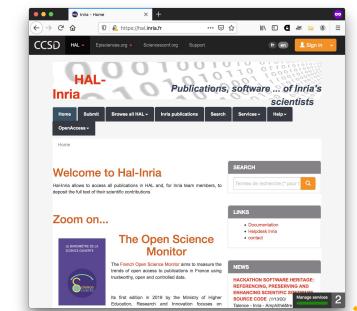


Credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).

# Sharing FAIR research products

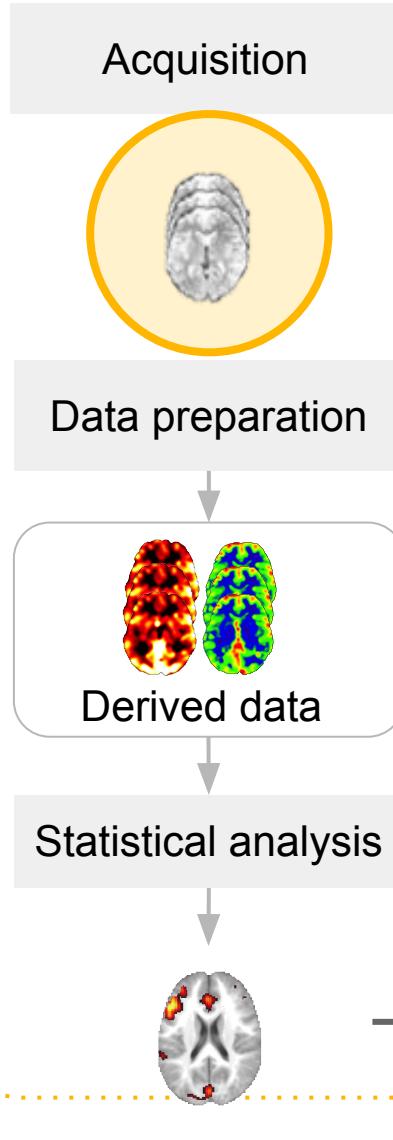


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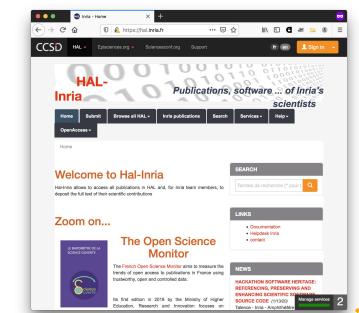


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Pubmed

# Sharing FAIR research products



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Biorxiv, arxiv,  
HAL,  
Pubmed

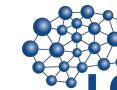
# Sharing FAIR datasets



# Sharing FAIR datasets



OpenNEURO



LORIS

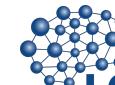
*Donders Repository*



# Sharing FAIR datasets



OpenNEURO



LORIS

*Donders Repository*



**Findable** we can search  
for open datasets in each  
repository

# Sharing FAIR datasets



OpenNEURO



LORIS



*Donders Repository*



**Findable** we can search  
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repository



**Accessible** Direct  
download (e.g. Openneuro)  
or with Data User  
Agreement (e.g. Donders)

# Sharing FAIR datasets



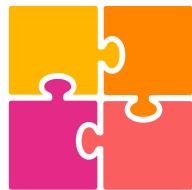
OpenNEURO



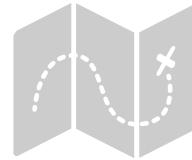
LORIS



*Donders Repository*



Interoperable?



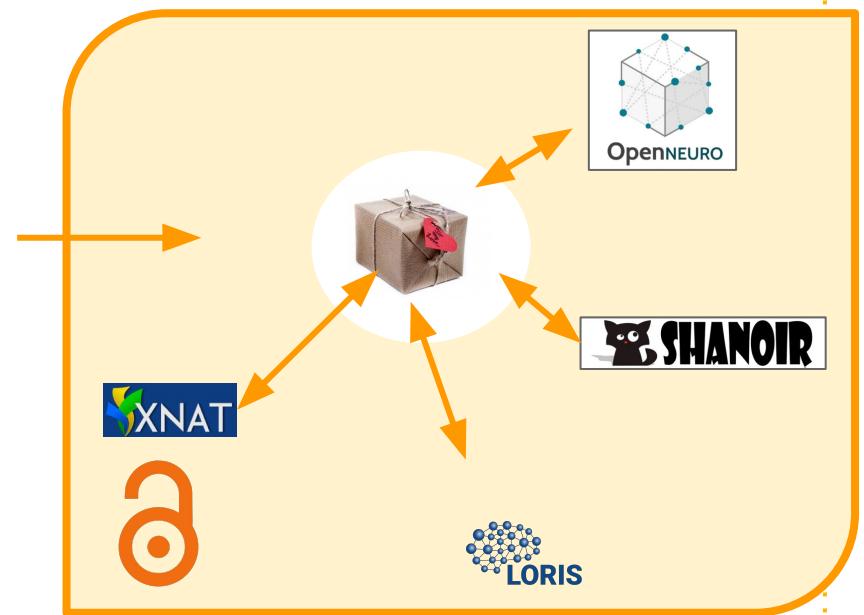
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repository



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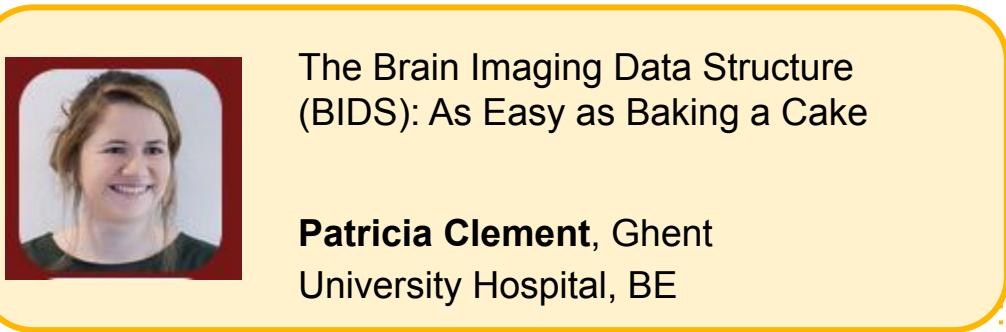
# Standards for neuroimaging data sharing

- Data and **meta-data**
- A common “language”



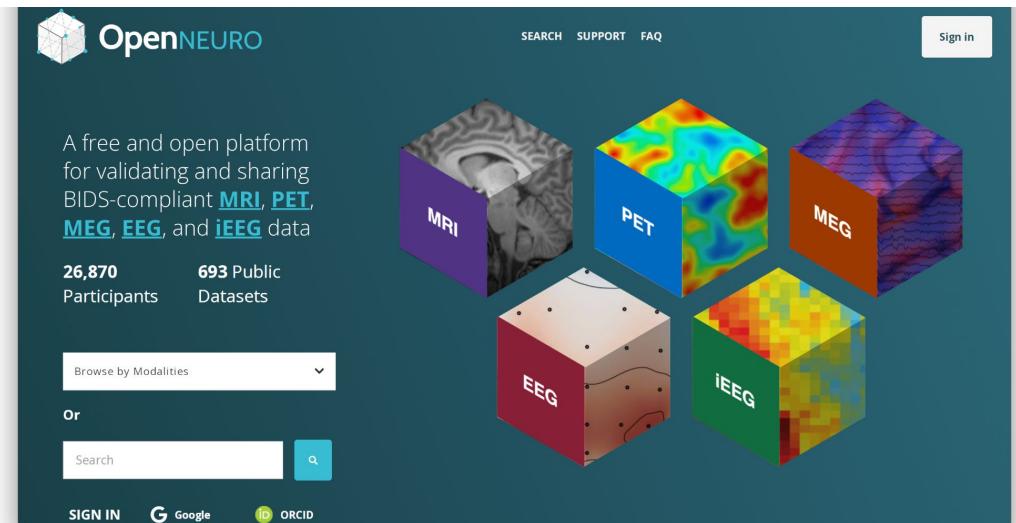
# Brain Imaging Data Structure

```
my_dataset/
  participants.tsv
  sub-01/
    anat/
      sub-01_T1w.nii.gz
    func/
      sub-01_task-rest_bold.nii.gz
      sub-01_task-rest_bold.json
    dwi/
      sub-01_dwi.nii.gz
      sub-01_dwi.json
      sub-01_dwi.bval
      sub-01_dwi.bvec
  sub-02/
  sub-03/
  sub-04/
```



The Brain Imaging Data Structure (BIDS): As Easy as Baking a Cake

**Patricia Clement**, Ghent University Hospital, BE



[Gorgolewski et. al, Scientific Data 2016]

<https://openneuro.org/>

# Sharing FAIR datasets



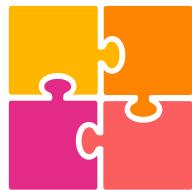
OpenNEURO



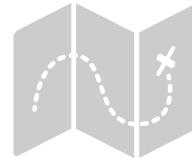
LORIS



*Donders Repository*



Interoperable?

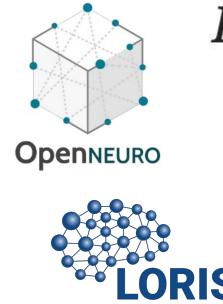


**Findable** we can search  
for open datasets in each  
repository

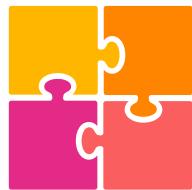


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download (e.g. Openneuro)  
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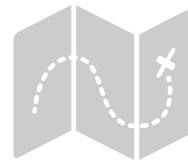
# Sharing FAIR datasets



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**Interoperable** BIDS acts as a common languages across tools



**Findable** we can search for open datasets in each repository

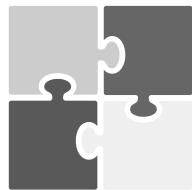


**Accessible** Direct download (e.g. Openneuro) or with Data User Agreement (e.g. Donders)

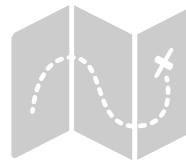
# Sharing FAIR datasets



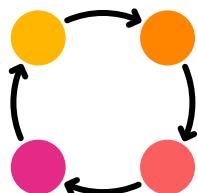
*Donders Repository*



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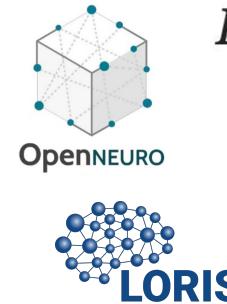


**Reusable** Metadata in BIDS were selected to enable reuse. e.g. onsets of the task for task-based fMRI.

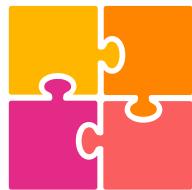


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# Sharing FAIR datasets



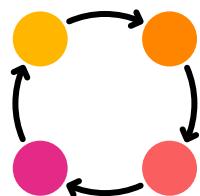
*Donders Repository*



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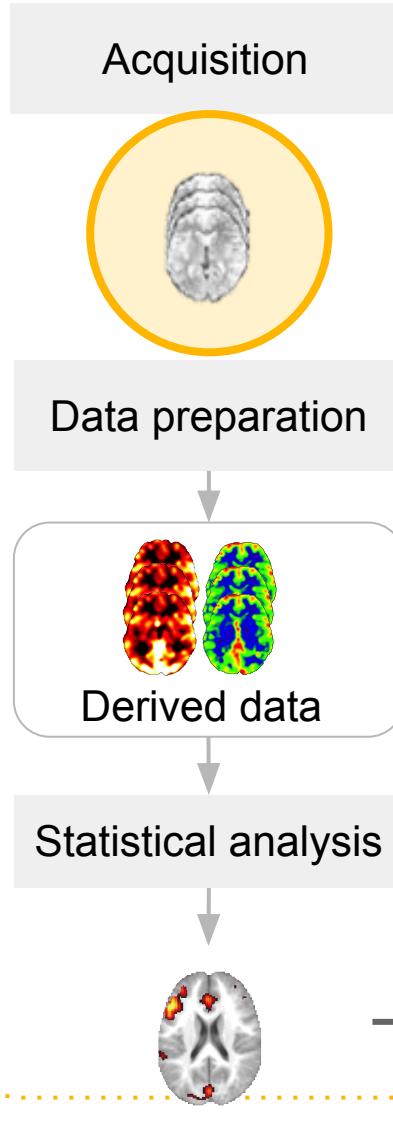


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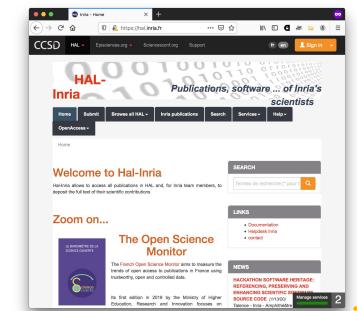


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# Sharing FAIR research products

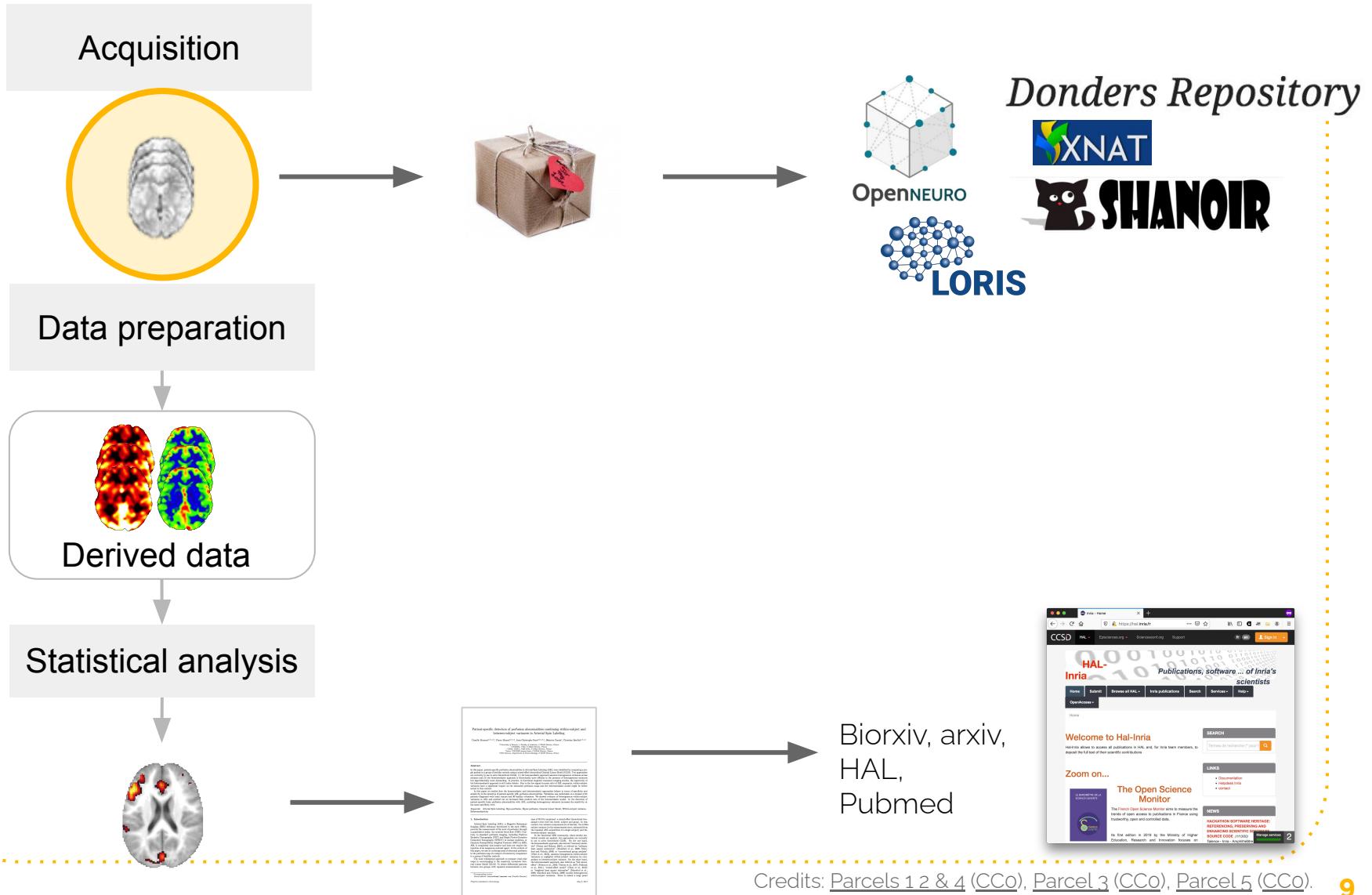


Credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).



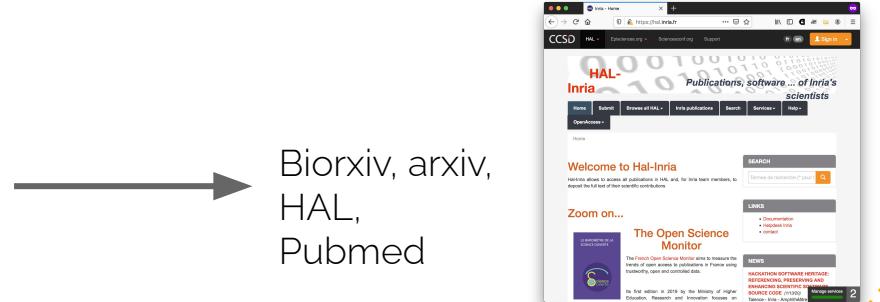
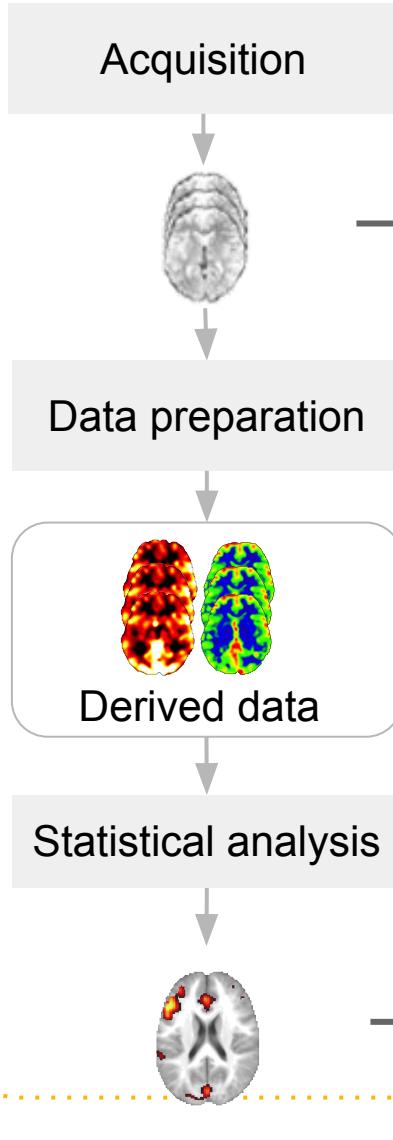
Biorxiv, arxiv,  
HAL,  
Pubmed

# Sharing FAIR research products



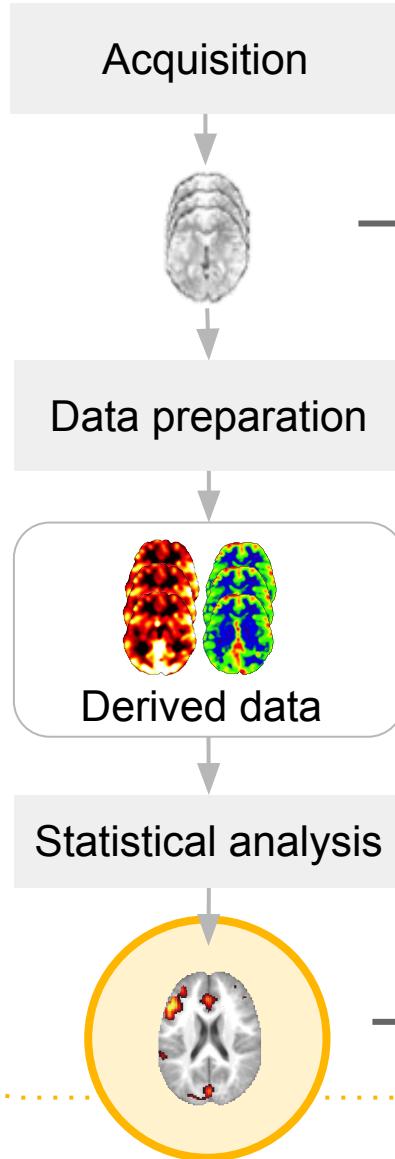
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# Sharing FAIR research products



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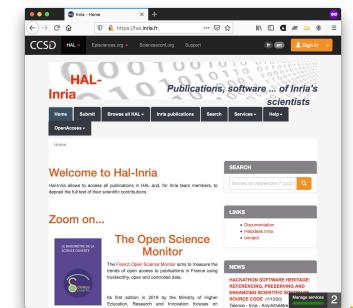
# Sharing FAIR research products



Credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).



*Donders Repository*



Biorxiv, arxiv,  
HAL,  
Pubmed

# Sharing FAIR results

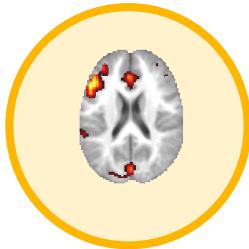
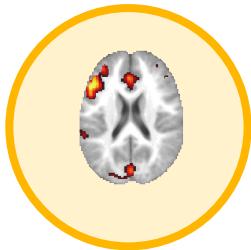
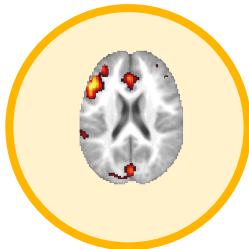


Image credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel 3 \(CCo\)](#), [Parcel 5 \(CCo\)](#).

# Sharing FAIR results (task fMRI)



# Sharing FAIR results (task fMRI)

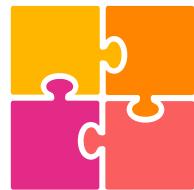
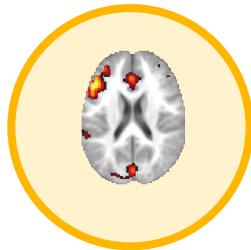


**Findable** we can search  
for datasets on  
NeuroVault



**Accessible** Direct  
download

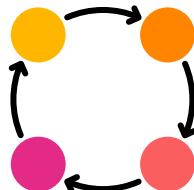
# Sharing FAIR results (task fMRI)



Interoperable?



**Findable** we can search  
for datasets on  
NeuroVault

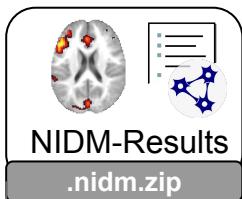


Reusable?

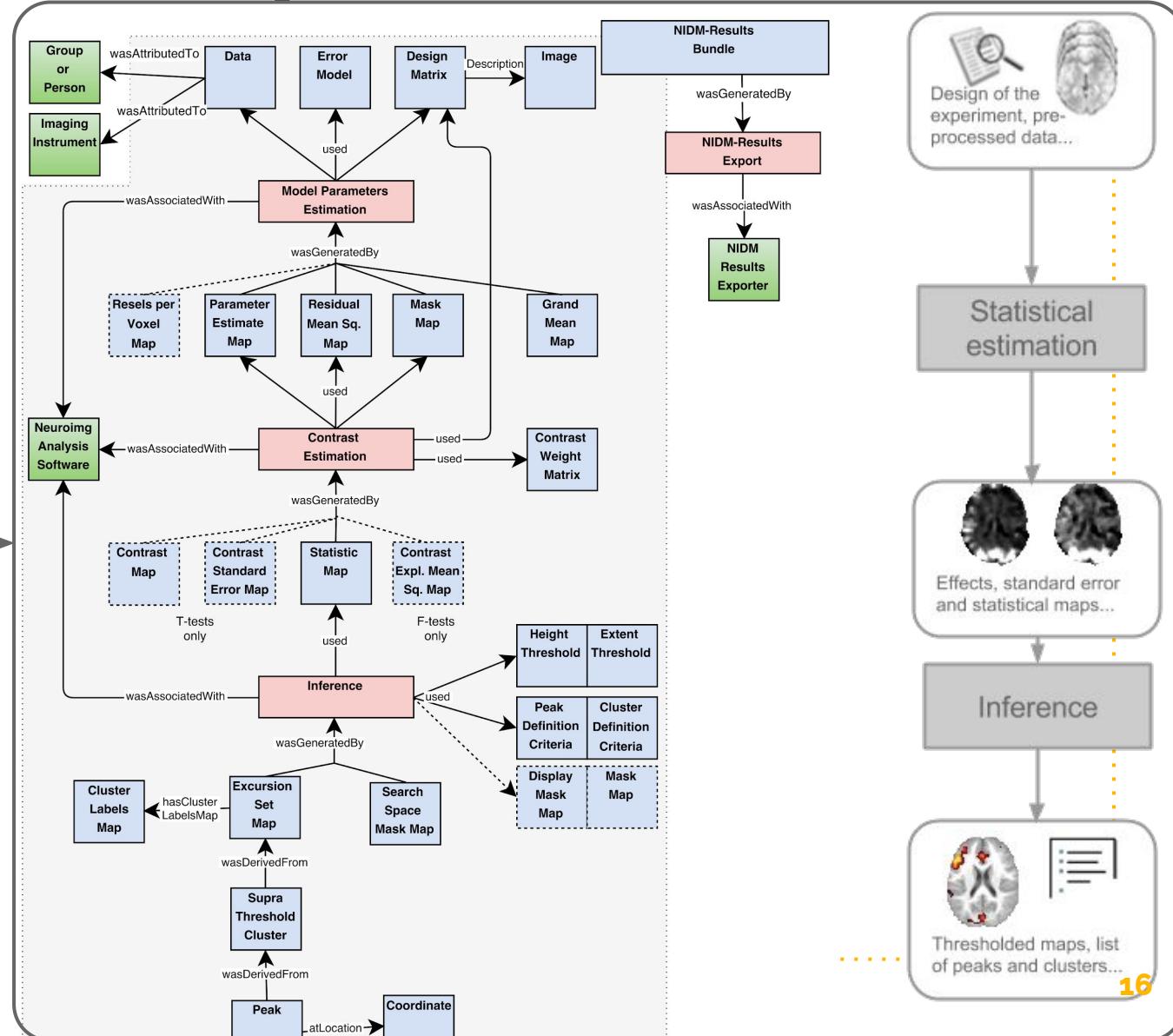


**Accessible** Direct  
download

# NIDM-Results pack



- ClusterLabels.nii.gz
- Contrast.nii.gz
- ContrastStandardError.nii.gz
- DesignMatrix.csv
- DesignMatrix.png
- ExcursionSet.nii.gz
- ExcursionSet.png
- GrandMean.nii.gz
- Mask.nii.gz
- nidm.json
- nidm.ttl
- ParameterEstimate\_001.nii.gz
- ParameterEstimate\_002.nii.gz
- ResidualMeanSquares.nii.gz
- SearchSpaceMask.nii.gz
- TStatistic.nii.gz
- ZStatistic.nii.gz



[Maumet et al.,  
Sci. Data 2016]

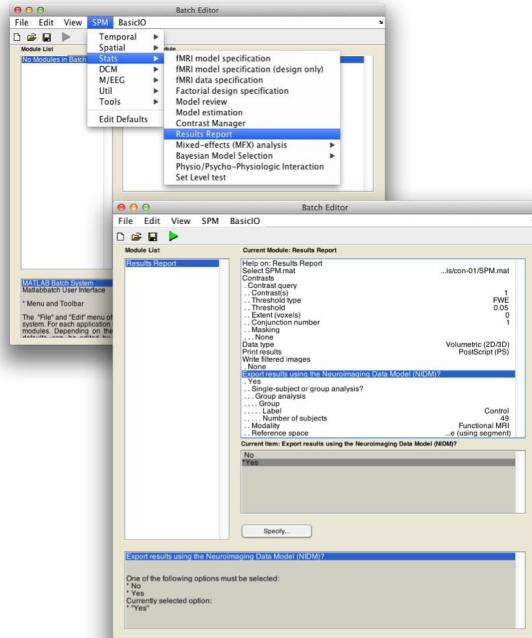
# NIDM in SPM, FSL & NeuroVault

SPM

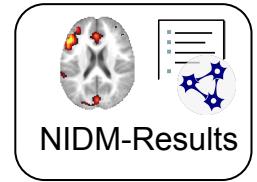
1. Export



```
$ nidmfsl fsl_ds107_group 49 -g Control
```



2. Publication on NeuroVault



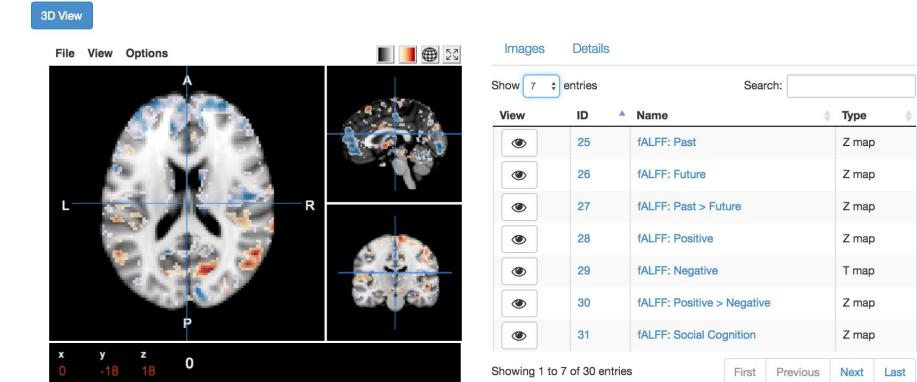
NeuroVault Collections FAQ Give feedback

## A Correspondence between Individual Differences in the Brain's Intrinsic Functional Architecture and the Content and Form of Self-Generated Thoughts

Contributed by ChrisPilatGorgolewski

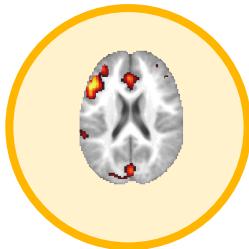
Krzysztof J. Gorgolewski, Dan Lurie, Sebastian Urchs, Judy A. Kipping, R. Cameron Craddock, Michael P. Milham, Daniel S. Margulies, Jonathan Smallwood

[Link to the paper](#)



<https://github.com/incf-nidash/nidmresults-spm>, <https://github.com/incf-nidash/nidmresults-fsl>

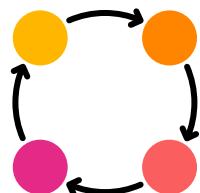
# Sharing FAIR results (task fMRI)



**Interoperable** NIDM-Results  
acts as a common  
languages across tools



**Findable** we can search  
for datasets on  
NeuroVault

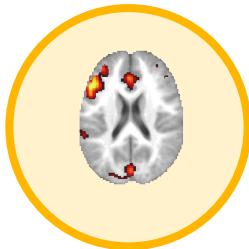


**Reusable** Metadata in  
NIDM-Results selected to  
enable meta-analyses



**Accessible** Direct  
download

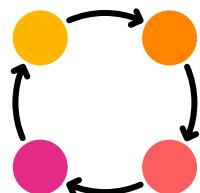
# Sharing FAIR results (task fMRI)



**Interoperable** NIDM-Results  
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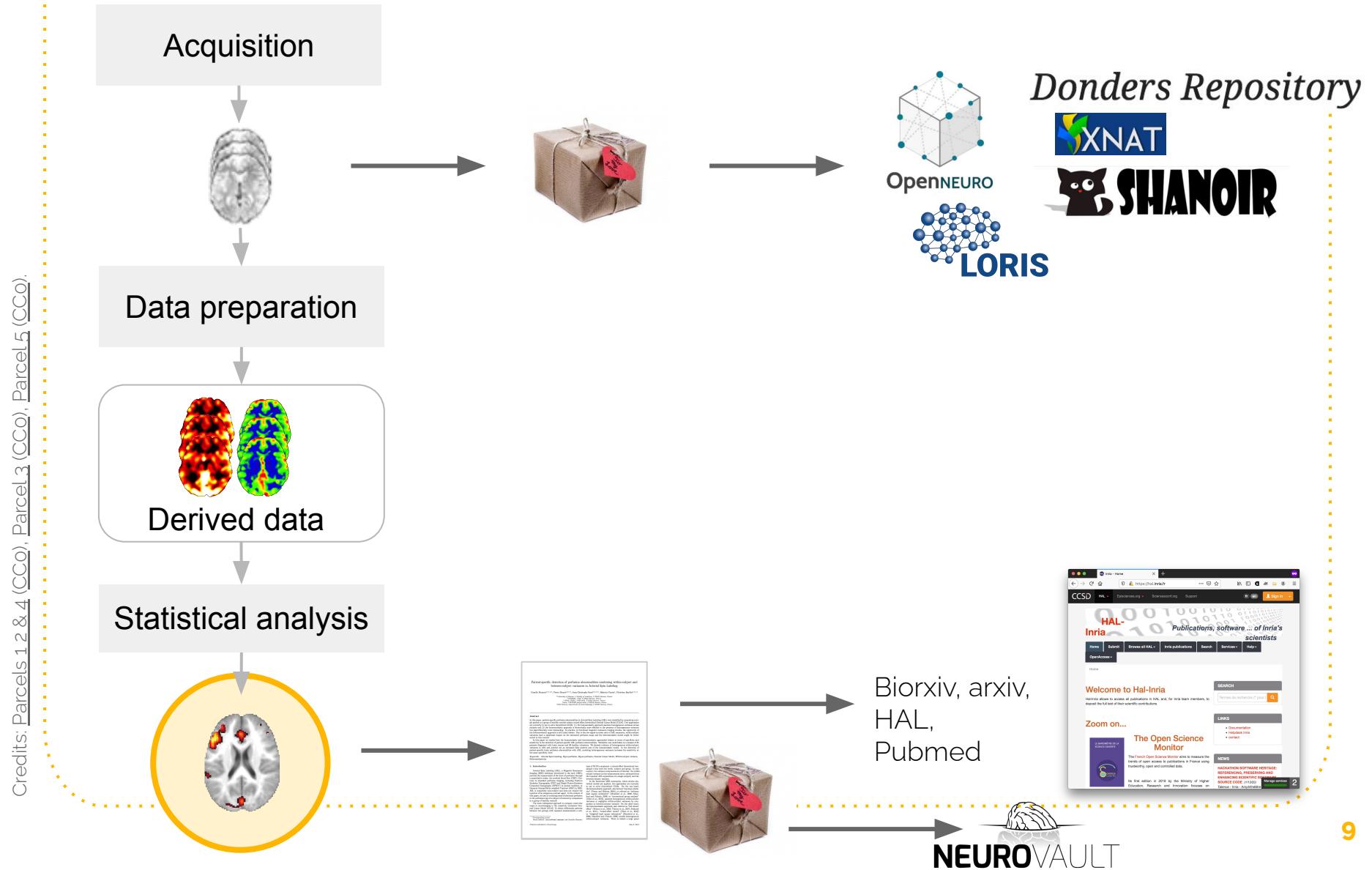


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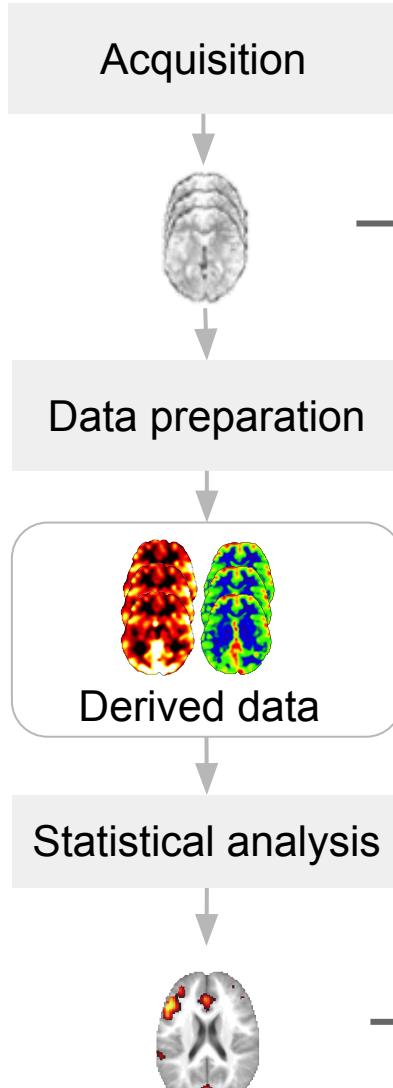
**Accessible** Direct  
download

# Sharing FAIR research products

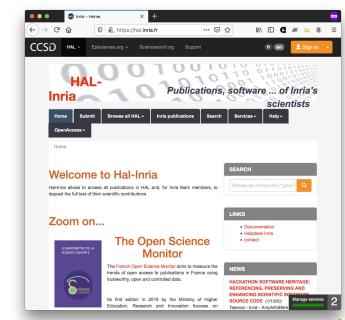


# Sharing FAIR research products

Credits: Parcels 1,2 & 4 (CCo) Parcels 3 (CCo) Parcels 5 (CCo)



Biorxiv, arxiv,  
HAL,  
Pubmed



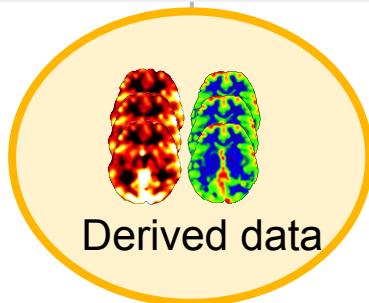
# Sharing FAIR research products

Credits: Parcels 1,2 & 4 (CCo) Parcels 3 (CCo), Parcels 5 (CCo).

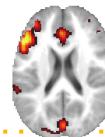
Acquisition



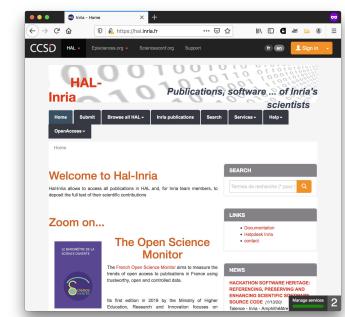
Data preparation



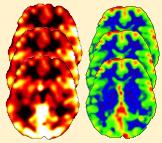
Statistical analysis



Biorxiv, arxiv,  
HAL,  
Pubmed

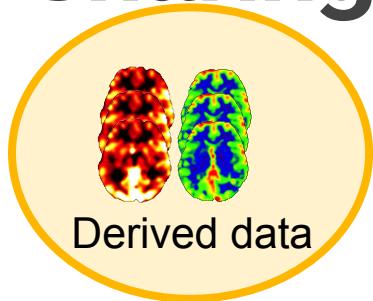


# Sharing FAIR intermediary datasets



Derived data

# Sharing FAIR intermediary datasets



Derived data

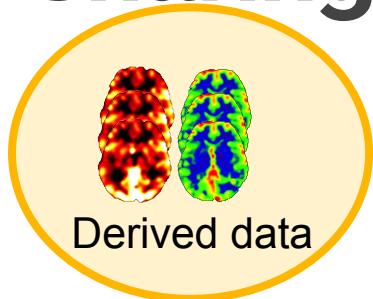


NITRC

zenodo

General purpose repositories

# Sharing FAIR intermediary datasets



NITRC

zenodo

General purpose repositories

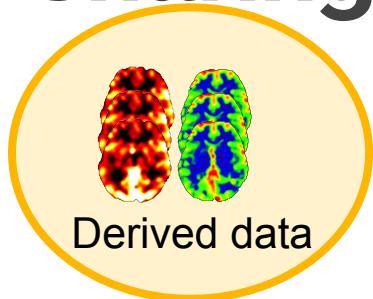


**Findable** can search for open datasets (less specific queries)



**Accessible** Direct download or Data User Agreement

# Sharing FAIR intermediary datasets



NITRC

zenodo

General purpose repositories

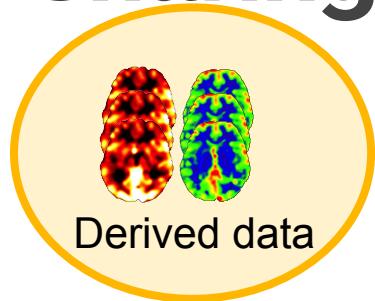


**Findable** can search for open datasets (less specific queries)



**Accessible** Direct download or Data User Agreement

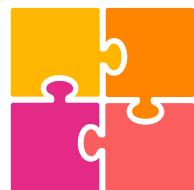
# Sharing FAIR intermediary datasets



NITRC



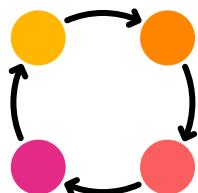
General purpose repositories



Interoperable?



**Findable** can search for open datasets (less specific queries)



Reusable?



**Accessible** Direct download or Data User Agreement

# Sharing other FAIR datasets

1- Look for existing standards and databases:



2- You can help develop the next standards

## BIDS Derivatives

<https://bids.neuroimaging.io/>

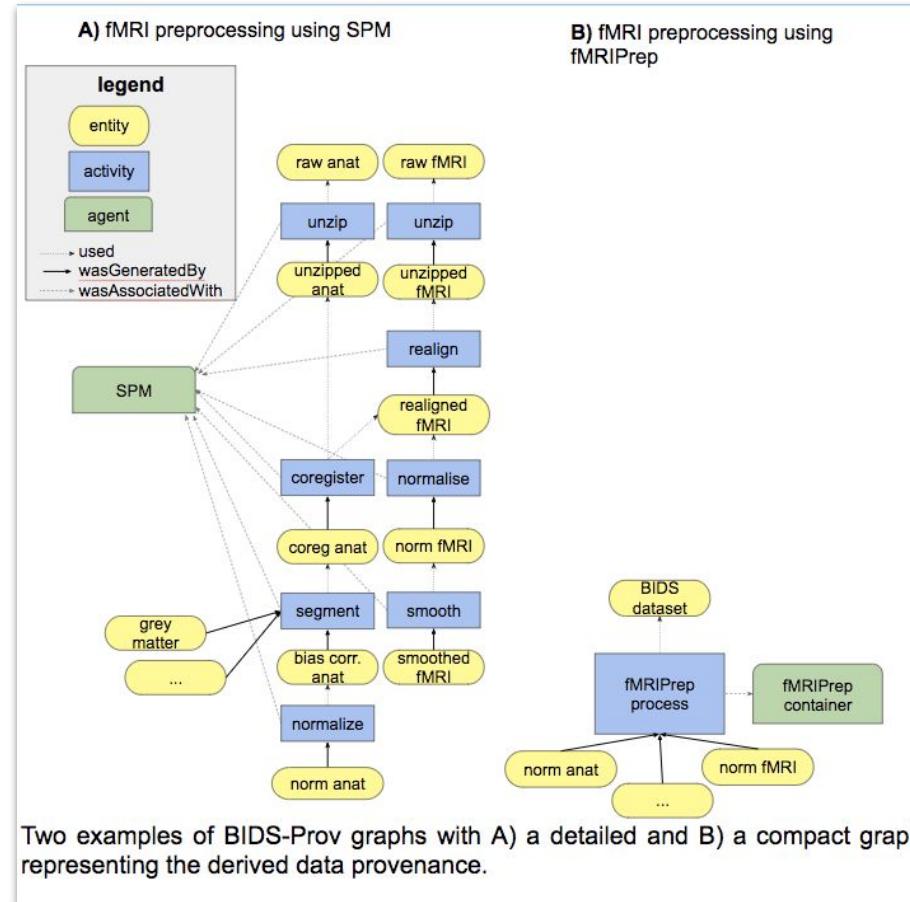
Derivatives are outputs of common processing pipelines, capturing data and meta-data sufficient for a researcher to understand and (critically) reuse those outputs in subsequent processing. Standardizing derivatives is motivated by use cases where formalized machine-readable access to processed data enables higher level processing.

- BEP011 The structural preprocessing derivatives
  - BEP012 The functional preprocessing derivatives
  - BEP013 The resting state fMRI derivatives
  - BEP016 The diffusion weighted imaging derivatives
  - BEP017 Generic BIDS connectivity data schema
  - BEP021 Common Electrophysiological Derivatives
- And more!

# BIDS Provenance



Satra  
Ghosh



[https://github.com/bids-standard/BEP028\\_BIDSProv](https://github.com/bids-standard/BEP028_BIDSProv)

Image credits: [Parcels 1 2 & 4 \(CCo\)](#), [Parcel3 \(CCo\)](#), [Parcel5 \(CCo\)](#).

# Provenance Use Case 1 An unambiguous description of the methods



# Provenance Use Case 1 **An unambiguous description of the methods**



Which release of SPM was used?

Which registration algorithm was selected?

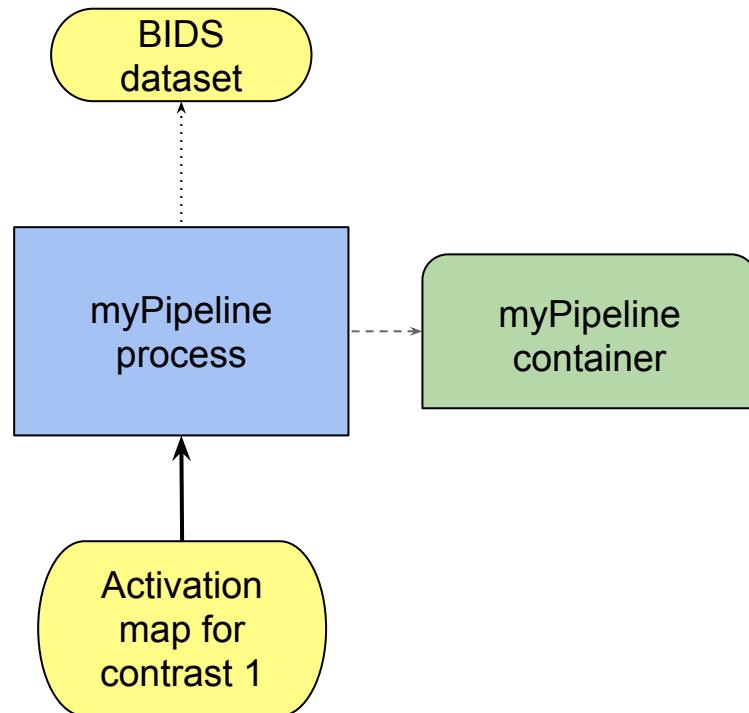
How was the brain mask computed?

Provenance Use Case 1

# An unambiguous description of the methods

Can we  
reproduce  
exactly the same  
results  
(same data, same  
methods)?

# Provenance Use Case 1 **An unambiguous description of the methods**



Can we  
reproduce  
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Provenance Use Case 2

# Dealing with unwanted variability

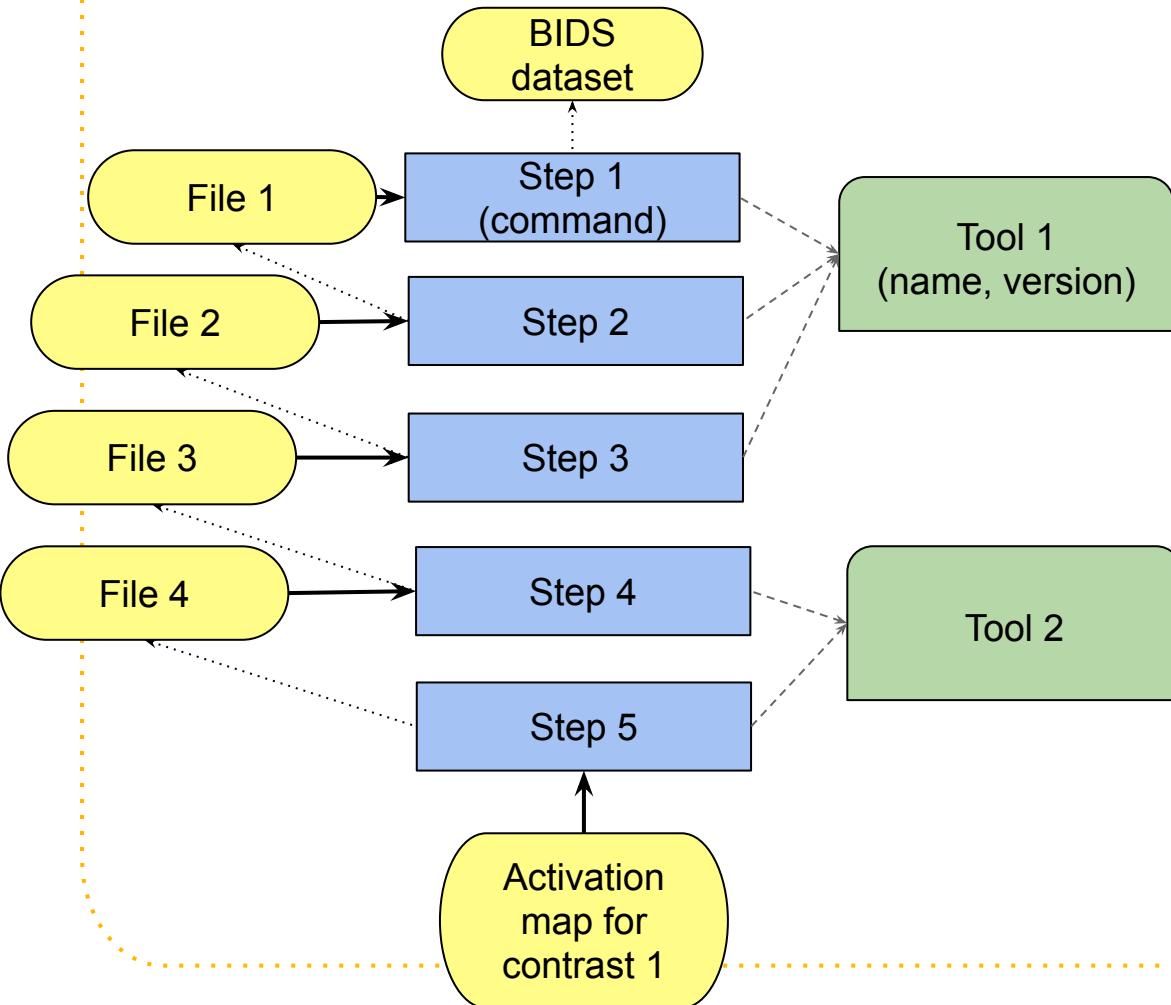
A previously widely-used parameter is no longer considered as best practice

# Provenance Use Case 2 **Dealing with unwanted variability**

A previously widely-used parameter is no longer considered as best practice

A bug was found in a given tool version, can we retrieve all corresponding results?

# Provenance Use Case 2 Dealing with unwanted variability

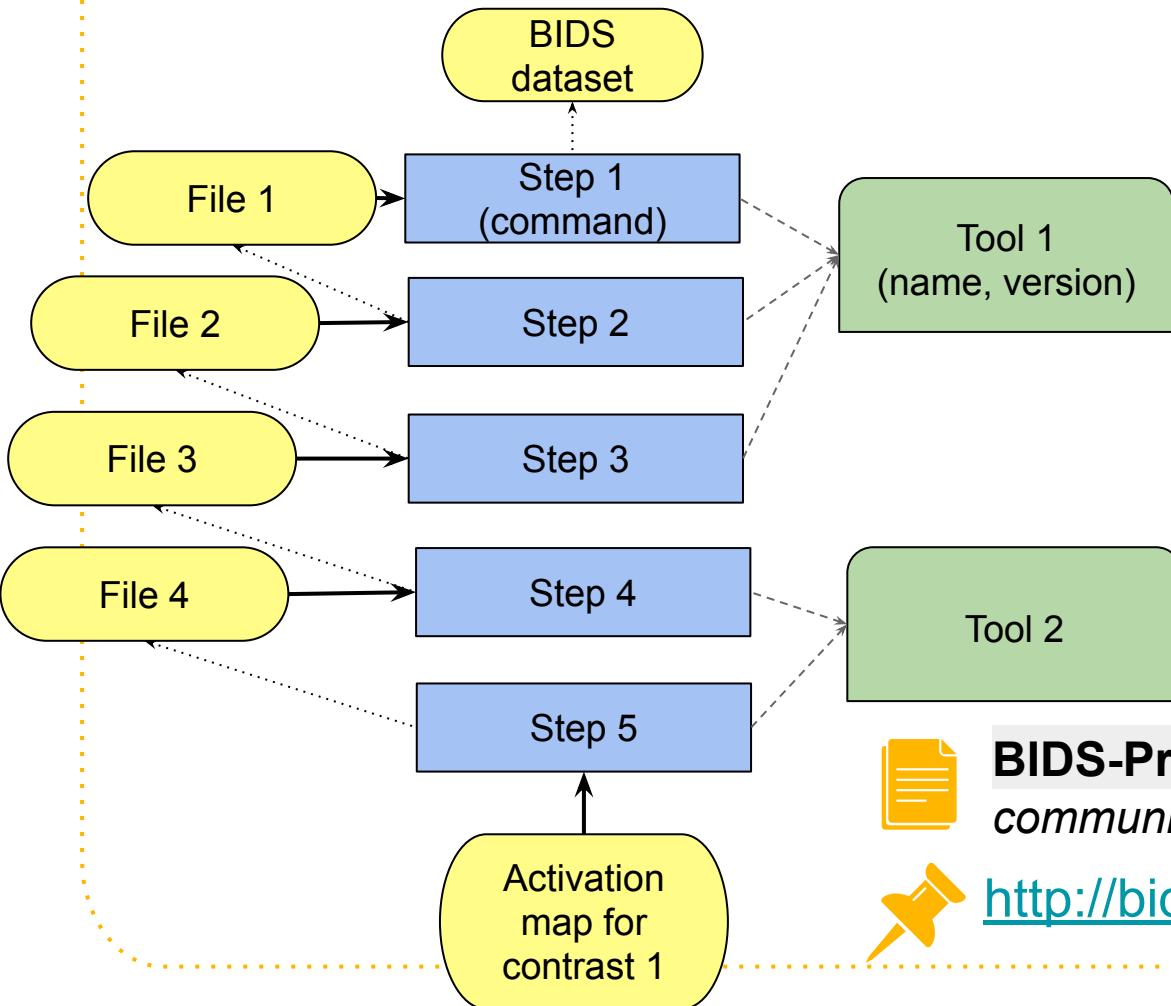


A previously widely-used parameter is no longer considered as best practice

A bug was found in a given tool version, can we retrieve all corresponding results?

Provenance Use Case 3

# Exploring factors impacting analytical variability



Are my conclusions dependant on the **size of the smoothing kernel** used at Step 5?



**BIDS-Prov** will soon be open for community feedback!



<http://bids.neuroimaging.io/bep028>

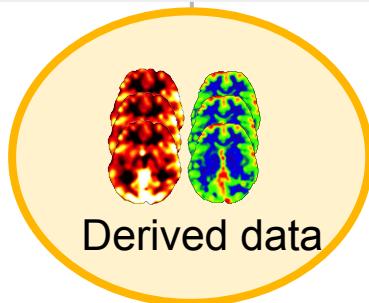
# Sharing FAIR research products

Credits: Parcels 1,2 & 4 (CCo) Parcels 3 (CCo), Parcels 5 (CCo).

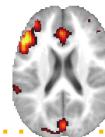
Acquisition



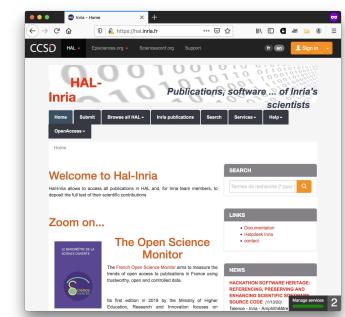
Data preparation



Statistical analysis



Biorxiv, arxiv,  
HAL,  
Pubmed



# Sharing FAIR research products

Credits: Parcels 1,2 & 4 (CCo) Parcels 3 (CCo), Parcels 5 (CCo).

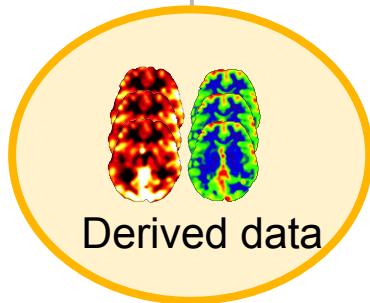
Acquisition



Donders Repository



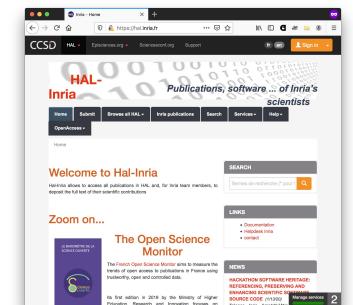
Data preparation



Statistical analysis



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# Sharing FAIR research products

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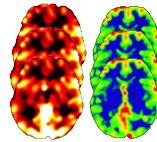
Acquisition



Donders Repository



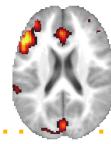
Data preparation



Derived data



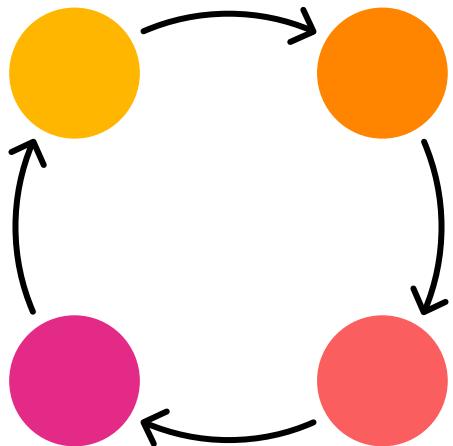
Statistical analysis



Biorxiv, arxiv,  
HAL,  
Pubmed



NEUROVAULT



## Reusing neuroimaging derived data?

Camille Maumet

# Thank you!



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@cmaumet@fediscience.org