



# The "*My data organization is as good as yours*" fallacy

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### Program



- Data acquisition & processing
- Issues with "my" data organization
- Brain Imaging Data Structure, aka. BIDS
- Take home message

### Data workflow...



#### Acquisition:

- #subjects
- #modalities
- #sessions/visits

#### "Simplest" fMRI project:

- Processing:Spatial processing
- Statistical analysis

- 20-40 subjects: young & healthy + demographics (age, sex, handedness)
- 1 fMRI session + 1 anatomical MRI
- → 1h/subject & data acquisition by 1 person in 1 month
- → "simple" processing by 1 person for 1 paper

### Data workflow...



#### Acquisition:

- #subjects
- #modalities
- #sessions/visits

## Processing:Spatial processing

• Statistical analysis

#### "Real" MRI project:

- 20-200 subjects: thorough phenotype + full neuropsy evaluation + ...
- Several modalities: MRIs, actimetry, EEG, blood/saliva,...
- Several sessions/visits: over days to months
- → >6h/subject & data acquisition by many persons over >1 year
- → data heterogeneity & asynchronous acquisition !

### My great MRI project...

Experiment time line (excl. ethics, insurance, funding, recruiting,...):

- Devise experimental protocol (stimuli/conditions, #groups, #subjects, etc.)
- Scan subjects, over some time: weeks, months, years
- Accumulate data on disk à la "My data organization is as good as yours"
- Process data, i.e. create processed data on disk (+ potentially mess up original data)
- Publish, i.e. reformat some of the results (& keep/forget the others)
- "Move on and forget about it!"
   (where is what?, what was published exactly?, how was it obtained?)

What next ? Reproducible results ? Reusable data ?

### Efficient data processing

### **Everything is scripted!**

- → Need to organize data/metadata
- Data selection through "filters"
  - Loop over subjects  $\rightarrow$  select subject specific data
  - Modality specific steps  $\rightarrow$  select specific modalities
- All parameters findable & accessible
- Preserve original data, raw or derived at previous step

### Data/metadata MUST be carefully organized & labelled,

i.e. human and computer readable

### Data workflow...





#### "Real" MRI project:

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### MRI data conversion



- Scanner  $\rightarrow$  DICOM format
  - Common format for different manufacturers but...one file per slice!
  - 100's of official metadata fields but... manufacturer and protocol private fields!
- Conversion to NITI (Neuroimaging Informatics Technology Initiative)
  - Open-format & community accepted but... (almost) no acquisition metadata stored
  - Full DICOM header can be dumped into sidecar JSON file, incl. cryptic manufacturer and protocol private fields

### Raw NIfTI MRI data



- One scanner Id per acquisition session
- ► Protocols identified by "Series number" → unreliable and unclear!
- Select series of images manually or through "filters" on indexes → error prone!
- ▶ Processing output in the same folder (sometimes) or files modified !
   → messy and risky!

s	0243	387						
— n11								
			f2438	-0004-	00001	000001-01.json		
			f2438	-0004-	00001	000001-01.nii		
			f2438	-0004-	00002	000002-01.json		
			f2438	-0004-	00002	000002-01.nii		
			f2438	-0004-	00003	000003-01.json		
			f2438	-0004-	00003	000003-01.nii		
			f2438	-0004-	00004	000004-01.json		
			f2438	-0004-	00004	000004-01.nii		
			f2438	-0004-	00005	000005-01.json		
			f2438	-0004-	00005	000005-01.nii		
			f2438	-0004-	00006	000006-01.json		
			f2438	-0004-	00006	000006-01.nii		
			f2438	-0004-	00007	000007-01.json		
			f2438	-0004-	00007	000007-01.nii		
			f2438	-0004-	00008	000008-01.json		
						000008-01.nii		
			f2438	-0004-	00009	000009-01.json		
			f2438	-0004-	00009	000009-01.nii		
			f2438	-0004-	00010	000010-01.json		
						000010-01.nii		
			f2438	-0005-	00001	-000001-01.json		
			f2438	-0005-	00001	-000001-01.nii		
			f2438	-0005-	00002	-000002-01.json		
			f2438	-0005-	00002	-000002-01.nii		
			f2438	-0005-	00003	-000003-01.json		



### Rename and organize the data "my way"

- Subjects' label and indexing ? → s23, HC23/AD18, ...
- Folder for each modality ?
  - functional MRI → fmri, func, funcMRI, functional,...
  - anatomical MRI  $\rightarrow$  amri, anat, struct, sMRI,...
- Image metadata ?
  - Which parameters ? E.g. echo & repetition time, slice order/time,...
  - Which units ? Seconds or milliseconds ?
  - Which name ? TE/TR, EchoT/RepT, Techo/Trepetition,...
  - ➔ From raw JSON file, "on the fly" vs. "extract and save aside" ?

### Rename and organize the data "my way"

- Other data,
  - demographic & behavioural information
  - stimuli timing & responses in fMRI
  - b-value & vectors in DW-MRI
- Saved/stored in
  - Distinct Excell files ? On "another computer" ?
  - PhD/postdoc/PI/lab-assistant's head ?
- → Do we have ALL the information ? Unique and clear ?
- → Script must be tailored to "my way" organization
- → Difficult to share/reuse across datasets & people

### "My organization" wish...

- Between colleagues
  - Similar dataset structure with small adjustments
  - "Quick & dirty" code to experiment
  - "Clean & documented" code for regular/final processing
  - Well-defined (& relative) path and file names
  - All metadata extracted from dataset, i.e. "one place"
- Between institutions/open source
  - Some more documentation
  - Limited or no hard-coded paths
  - Issues/bugs follow up
  - Increased flexibility for (local) data specificities



### Data workflow...



#### Acquisition:

- #subjects
- #modalities
- #sessions/visits

#### **Data accumulation**

- Data organization
- Metadata extraction

#### **Processing:**

- Spatial processing
- Statistical analysis

### Need to

- know what data and metadata are needed, e.g. acquisition parameters for all data, task description and subject's responses, subjects' parameters,...
- ► convert/extract data and metadata → explicit & easy to find How to organize and name all these ? Define a nomenclature!

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#### "DRY - Don't Repeat Yourself –

#### Every piece of knowledge must have a single, unambiguous, authoritative representation within a system."

- Andy Hunt & Dave Thomas

#### "Data dominates.

If you've chosen the right data structures and organized things well, the algorithms will almost always be self-evident. Data structures, not algorithms, are central to programming." – Rob Pike in 1989

### **Brain Imaging Data Structure**

- Community effort
  - Started in 2015
  - Current version 1.10.0
- Human readable
  - Minimized curation
  - Error checking & reduction
- Computer readable
  - Optimized usage of data
  - Analysis software
  - Development of automated tools

#### scientific data

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Article | Open access | Published: 21 June 2016

### The brain imaging data structure, a format for organizing and describing outputs of neuroimaging experiments

Krzysztof J. Gorgolewski ⊠, Tibor Auer, Vince D. Calhoun, R. Cameron Craddock, Samir Das, Eugene P. Duff, Guillaume Flandin, Satrajit S. Ghosh, Tristan Glatard, Yaroslav O. Halchenko, Daniel A. Handwerker, Michael Hanke, David Keator, Xiangrui Li, Zachary Michael, Camille Maumet, B. Nolan Nichols, Thomas E. Nichols, John Pellman, Jean-Baptiste Poline, Ariel Rokem, Gunnar Schaefer, Vanessa Sochat, William Triplett, ... Russell A. Poldrack + Show authors

Scientific Data 3, Article number: 160044 (2016) | Cite this article

70k Accesses | 783 Citations | 105 Altmetric | Metrics

### Brain Imaging Data Structure

- Fixed specific file & (sub)folder naming
- Fixed specific file organization in subfolders
- Complete representation of data set, incl.
  - Experimental design & project information
  - Subject specific information
  - Data types & acquisition parameters
  - Original raw data, intermediate/derivative data & final results
  - Processing information & derived data/results
  - Ownership & references



### **BIDS** goal



With only the data and metadata in >MyExperiment folder, be able to

- → understand the whole experiment & data,
- → check data consistency,

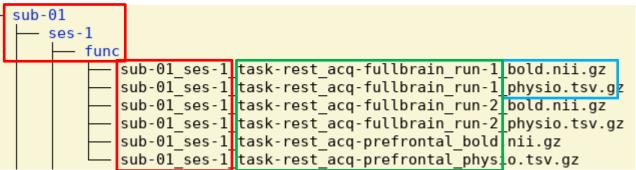
e.g. same acquisition parameters, missing modality in 1 subject,...

→ reprocess (automatically) the whole dataset,

e.g. generate all the results from my papers or test a new tool,

→ reuse any part of the data, e.g. for another project, and/or share with others.

### **BIDS naming principles**



#### Directories:

- sub-<label>: per subject
- ses-<label>: per session (optional)
- <data type>: group of different types of data
- Names:
  - sub-<label> and ses-<label>
  - <suffix>: modality ("kind" of image)
  - <*entity>-*<*label>*: acquisition parameters or properties of image(s)

### **BIDS data files**



#### All images → NIfTI files, .nii

3D volume or 4D for "series", e.g. fMRI and DWI (actually, zipped .nii are preferred)

#### Meta-data

- ► array → "tab-separated value" files, .tsv
- ▶ key/value pair → JSON files, .json
- b-values/vectors text file, .bvec/.bval
- "description" files → text & Markdown file, Readme.txt, changes.txt, description.md

### All open-format file types !

### BIDS, metadata files

Key name	Requirement Level	Data type	Description
EchoTime	RECOMMENDED, but REQUIRED if corresponding fieldmap data is present, or the data	number or array of numbers	The echo time (TE) for the acquisition, specified in seconds. Corresponds to DICOM Tag 0018, 0081 Echo Time (please note that the DICOM term is in milliseconds not seconds). The data

- Stored in JSON file
- Strict definition: conventions and units

#### Requirement levels:

- REQUIRED: needed to interprete data
- RECOMMENDED: will improve interpretation
- OPTIONAL: might be useful

```
"CogAtlasID": "https://www.cognitiveatlas.org/id/trm_4c8a834779883",
"EchoTime": 0.017,
"EffectiveEchoSpacing": 0.0003333262223739227,
"PhaseEncodingDirection": "j-",
"RepetitionTime": 3.0,
"SliceEncodingDirection": "k",
```

### BIDS, Modality agnostic (top-level) files

Participants description, participants.tsv/.json

participant_id	sex	age	number	handedness
sub-01	F	29	17	100
sub-02	F	23	6	100
sub-03	М	25	18	86
sub-04	М	26	8	100

.json file describes each variable (unit, range, possible value,...)

#### Dataset description, dataset description.json

```
"Name": "Processed MPM qMRI aging data",
"BIDSVersion": "1.8.0",
"DatasetType": "derivative",
"Authors": [
        "Martina F. Callaghan",
        "Christophe Phillips"
],
```

"Acknowledgements": "Elaine Anderson, Marinella Cappelletti, Rumana Chowdhury, Joern Diedirchsen, Thomas H. B. Fitzgerald, and Peter Smittenaar as part of multiple cognitive neuroimaging studies performed at the Wellcome Centre for Human Neuroimaging",

```
"HowToAcknowledge": "Please cite this paper: https://doi.org/10.1016/j.neurobiolaging.2014.02.008",
"ReferencesAndLinks": [
    "https://doi.org/10.1016/j.neurobiolaging.2014.02.008",
    "Callaghan et al., Neurobiology of Aging, 2014."
],
```



### **BIDS Extension Proposals**



### Various modalities, same principles

- Magnetoencephalography (MEG) 2018, Sci Data 5, 180110 (2018)
- Electroencephalography (EEG/iEEG) 2019, Sci Data 6, 102 & 103 (2019)
- Positron emission tomography (PET) 2022, Sci Data 9, 65 (2022)
- Quantitative MRI (qMRI) 2022, Sci Data 9, 517 (2022)
- Microscopy 2022, Front Neurosci, 16 (2022)
- Magnetic Resonance Spectroscopy (MRS) 2024, (publication soon)
- Derivatives "work in progress".

https://bids.neuroimaging.io/get\_involved.html

### **BIDS development & adoption**



BIDS is community driven and broadly accepted

- Clear use cases & solving a common end user problem
- Low technical barrier to entry
- Maturity and the size of the field (30 years of NI)
- Open doors without "death by consensus"

### But...

- Data conversion remains challenging!
- Lack of a (complete) machine-readable standard
- Challenges of "BIDS Extension Proposals" management

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### Human perspective

- BAD (or not so convenient) day
  - Considerable effort to organize data
  - Sometimes confusing and contradictory descriptions
  - Need to integrate all acquisition data
  - Need careful planning before acquiring data

### GOOD day

- Easy to retrieve information
- Easy to run pipelines
- Easy to share data, e.g. your colleague (or yourself in 2 years)

### **Computer perspective**



#### GOOD day

- Easy to retrieve data and metadata
  - bids-matlab, pybids query based data retrieval
- Easy to patch errors
- Easy to write pipelines

qmri, fmriprep – query based data retrieval

- Modular composition ("BIDS in, BIDS out")

### NOT SO GOOD day

- Rare case of missing metadata  $\rightarrow$  improvise & patch
- Cases of modalities not included in BIDS  $\rightarrow$  improvise
- No strict regulation of pipeline outputs (derivatives)  $\rightarrow$  improvise





### Data curation is a pain, really. ...but it saves you from more pain later on ! Think BIDS & open data by design.

### <u>References</u>

- ▶ BIDS specifications  $\rightarrow$  "what & how to", <u>https://bids.neuroimaging.io/</u>
- ▶ BIDS data  $\rightarrow$  "example & re-use", <u>https://openneuro.org/</u>
- BIDS-fication tool  $\rightarrow$  "let's do it for real",
  - Dcm2bids (only MRI), <u>https://cdnis-brain.readthedocs.io/dcm2bids/</u>
  - BIDScoin (mostly imaging), <u>https://bidscoin.readthedocs.io/en/stable/</u>
  - BIDSme (multi-modal), https://github.com/CyclotronResearchCentre/bidsme



### Thank you for your attention!

