# NWB User Days 2023

Using the DANDI Archive







#### For Producers of Data

- Making a well-annotated dandiset
- How to ensure your files follow 'Best Practices'

#### For Consumers of Data

- How to find candidate data on DANDI for re-analysis
- How to perform quick quality checks on an entire DANDI set
- How to stream data directly from the DANDI Archive

#### For Both

- How to update analysis scripts to read from the NWB versions of the data
- How to use the **free** DANDI Hub compute resources

#### How to use the **free** DANDI Hub compute resources

- Step 1: Make an account on <a href="https://dandiarchive.org">https://dandiarchive.org</a>
  - ▶ 1a: Requires a GitHub account
  - ▶ 1b: Wait for account approval (~1 day)
- Step 2: Go to <a href="https://hub.dandiarchive.org/">https://hub.dandiarchive.org/</a>
  - ► 2a: Sign in
  - 2b: Select instance size (amount of resources)
  - 2c: Wait a couple of minutes



You're in!



# Making a well-annotated Dandiset





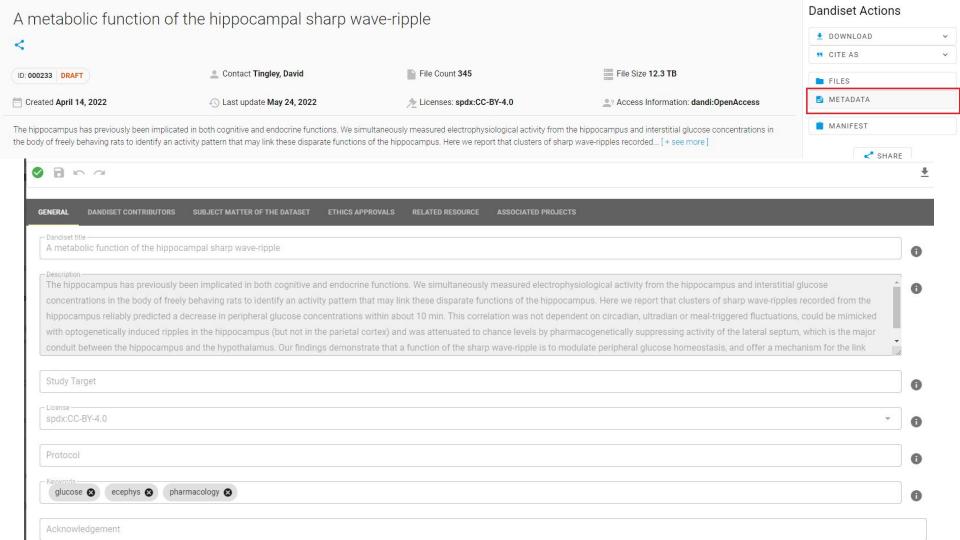


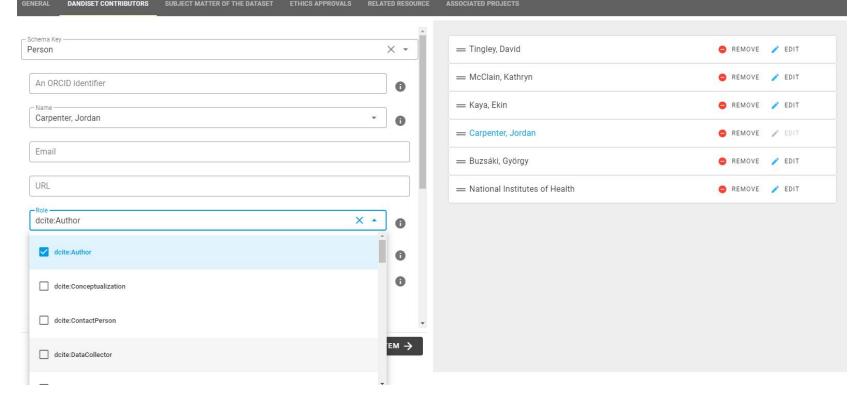




#### Register a new dataset

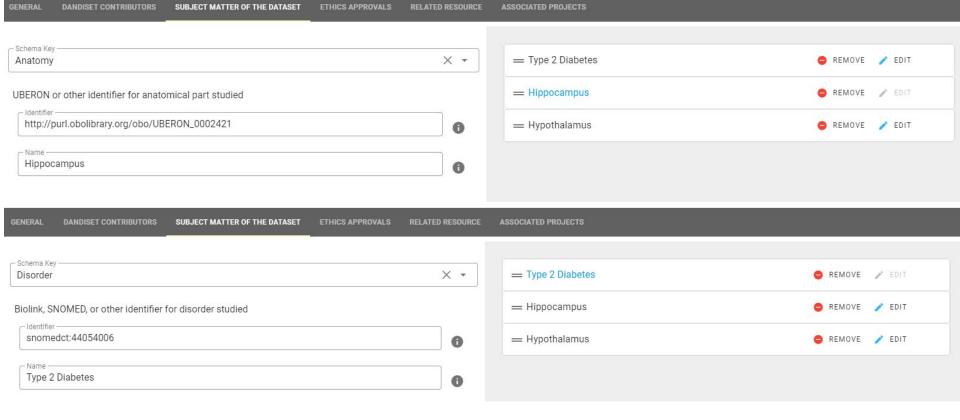
_ Name*	
Usually the name of my publication	
Provide a title for this dataset	
Description*	
Usually the abstract of my publication; if pre-publication, basic description of the type of exp	eriments.
Provide a description for this dataset	
☐ Embargo this dataset (What is this?)	
spdx:CC-BY-4.0	



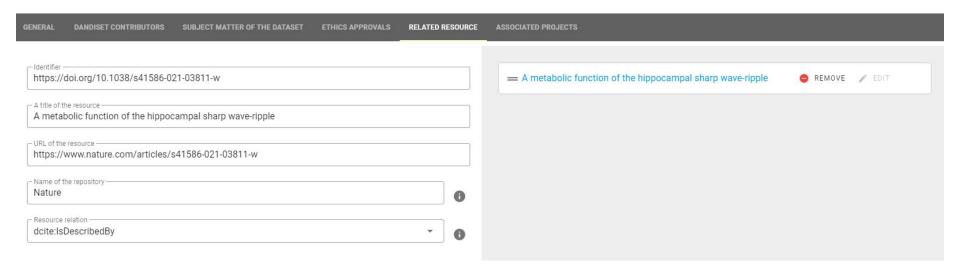


Be generous with assigning contributors - these don't just have to be the main authors of the citation The 'role' can take on many values...

Remember to link to ORCID and ROR affiliations for maximal findability!



Be as precise as possible by linking subject matter with specific ontologies



And, of course, link to the publication...



#### **DANDI Documentation**

#### **DANDI** Documentation

Welcome

Introduction

Data Standards

User Guide

#### Using DANDI

**Dandisets** 

**Ouick Start** 

Next steps

Dandiset Actions

Tools to interact with DANDI

**DANDI** Web application

**DANDI Python client** 

Dandihub analysis platform

Citing DANDI

Viewing Dandisets

Downloading Data and **Dandisets** 

Creating Dandisets and Uploading Data

Make NWB files

PUBLIC DANDISETS

Inspect NWB files

nwbinspector path/to/your/folder

- 3. Fix/improve as much as you are able
- Download empty dandiset

dandi download DANDI: < six-digit-id>

Organize 5.

```
cd <six-digit-id>
```

dandi organize ../path/to/your/folder

6 Validate

dandi validate path/to/your/folder

Upload

dandi upload

How to ensure your files follow 'Best Practices'

How to perform quick quality checks on an entire DANDI set

# NWB Inspector: A command-line tool for scanning NWB files

Cody Baker
Ryan Ly
Oliver Ruebel
Ben Dichter

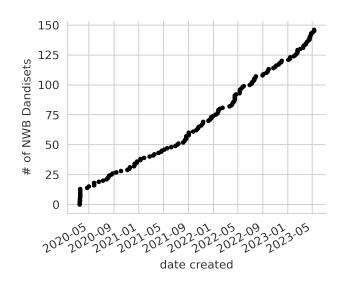






## Inspecting NWB files submitted to DANDI

#### NWB DANDI submissions continue to rise



- Passing schema validation does not mean the data is easily re-usable
- Some files have had data engineering mistakes *e.g.*, incorrect data orientation for any TimeSeries subtype
- Many datasets would benefit from more complete metadata
- Users can read and follow <u>NWB Best Practices</u>...
  - ...a lot of work
  - ...constantly updated using DANDI recommendations





## Checking NWBFiles for Best Practices - Manual

As the <a href="NWB Best Practices">NWB Best Practices</a> list grows in size and complexity...

- It becomes more difficult for individuals converting to NWB to read it all and manually ensure compliance
- More often, professional reviewers of NWB files and Dandisets (i.e., Ben Dichter, Satrajit Ghosh, et al.)
  - manually inspect each dataset
  - identify areas of improvement
  - communicate these to the original creators
- This can be a very time consuming process, especially as the upload rate of NWB files is growing every week

- General
- Neurodata Types
- NWBFile Metadata
  - File Organization
  - File Metadata
  - Subject
- Time Series
- Data Orientation
- Units of Measurement
- Time Series: Time References
- Subtypes
- Breaks in Continuity
- o Timestamps vs. Start & Rate
- Chunk Data
- Compress Data
- Unknown Resolution
- Tables
  - Tables With Only a Single Row
  - Table Region Data
  - Boolean Columns
  - Timing Columns
- Extracallular electrophysiology
  - Electrodes
  - Units Table
- Optogenetics
  - OptogeneticSeries
- Simulated Data
- Extensions
  - Use Existing Neurodata Types
  - Provide Documentation
  - Write the Specification to the NWBFile





#### **NWB** Inspector

- NWB Inspector automates the task and provides immediate, autonomous feedback
- Implements a collection of "checks" that map to the NWB Best Practices document
- Checks are categorized by importance:
  - CRITICAL: potentially incorrect data (9 checks)
    - will prevent DANDI upload and publication
  - ► BEST PRACTICE VIOLATION: very suboptimal data representation (20 checks)
  - ► BEST PRACTICE SUGGESTION: improvable data representation (15 checks)





## CLI Usage

■ Installation in any Python 3.7-3.10 environment - current release is **v0.4.29** 

pip install nwbinspector

#### ■ Simple command line usage

nwbinspector path/to/your/data.nwb

nwbinspector path/to/your/folder





#### CLI: Human-readable Output

```
NWBInspector Report Summary
Timestamp: 2022-04-14 18:08:40.949499+00:00
Platform: Linux-5.11.0-1019-aws-x86 64-with-glibc2.31
NWBInspector version: 0.3.11
Found 307 issues over 39 files:
     43 - CRITICAL
     55 - BEST PRACTICE VIOLATION
    209 - BEST PRACTICE SUGGESTION
******************************
0 CRITICAL
=========
0.0 check timestamps match first dimension
0.0.0 sub-Cori/sub-Cori_ses-20161214T120000.nwb and 38 other files: 'IntervalSeries' object at location '/processing/behavior/BehavioralEpochs/wheel moves'
        Message: The length of the first dimension of data does not match the length of timestamps.
1 BEST PRACTICE VIOLATION
______
1.0 check negative spike times
.....
1.0.3 sub-Cori/sub-Cori ses-20161218T120000.nwb and 9 other files: 'Units' object with name 'units'
```

Message: This Units table contains negative spike times. Time should generally be aligned to the earliest time reference in the NWBFile.





## Streaming on DANDI

- No need to download an entire DANDI set ahead of time
  - Stream directly from the archive with the flag

```
--stream
```

- Easiest way to run this is to log into the DANDI Hub
  - Default terminal is already installed and configured
- When running over a large DANDI set...
  - Output can be dense (even with aggregation), so you can save the report with

```
--report-file-path ./save my report.txt
```

- Scan can be 'relatively' slow, so you can speed it up with
  - $--n-jobs \times where \times is an integer (-1 will use all available processes)$
  - Spawn the Hub with a 'large' instance for turbo speeds!





How to find candidate data on DANDI for re-analysis How to stream data directly from the DANDI Archive

## DANDI Search and Access





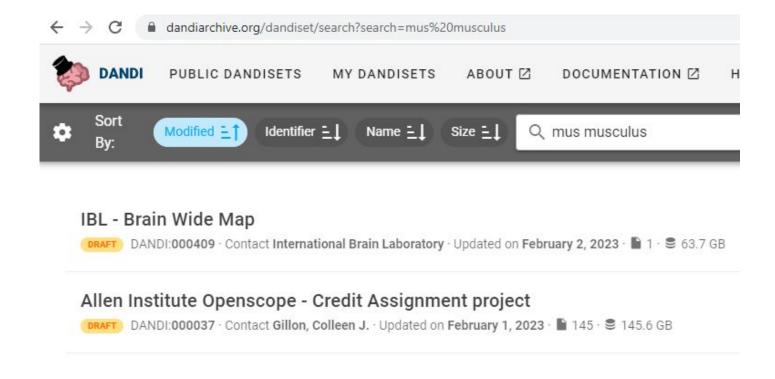






#### From the Web Interface

From the main page <a href="https://dandiarchive.org/dandiset">https://dandiarchive.org/dandiset</a>, type a query in the search bar



#### From the Web Interface

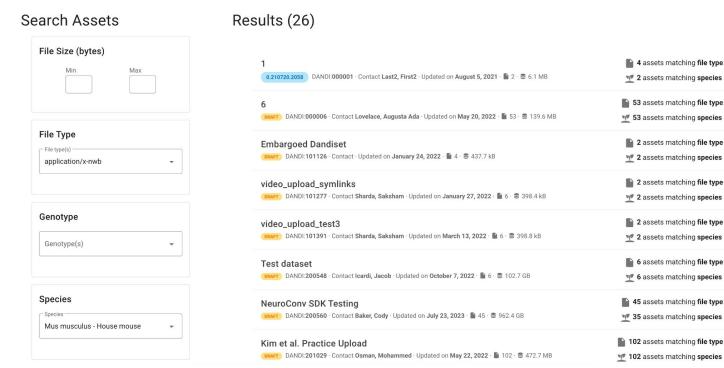
- These top-level queries look at the highest level of Dandiset metadata
  - Titles, keywords, dandiset description
  - Automatically extracted subject species, modality, and techniques
  - You can see these fields listed at the bottom of the main page of any dandiset

Assets Summary		Variable Measured	
Species		ElectrodeGroup	
Mus musculus - House mouse	<b>©</b>	ElectricalSeries	
Rattus norvegicus - Norway rat	<b>©</b>	Measurement Technique	
Approach		multi electrode extracellular electrophysiology recording technique	
electrophysiological approach		surgical technique	

## Coming soon - advanced search

■ Early unreleased version of advanced search criteria:

https://gui-staging.dandiarchive.org/search



#### From the Web Interface

- Good for...
  - A quick glance at general content
  - Casual browsing for any data of relevance to your hypotheses
  - Finding the dandiset for a particular publication
    - usually the title, or linked as a Related Resource ('IsDescribedBy')
  - Finding all the dandisets belonging to a particular lab
    - search by name of a 'Contributor'
  - Finding all the dandisets that use a particular species
    - ➤ Latin binomial, e.g.: Mus musculus, Rattus norvegicus, etc.

#### From the Web Interface

- Doesn't yet help with...
  - Presence or absence of identified brain regions
    - unless the creator of the dandiset set these as keywords or 'subject matter'
  - Presence or absence of exact brain coordinates (like Allen CCFv3)
  - Identification of vast variety of behavioral techniques
    - open exploration vs. maze task
    - virtual reality vs. simple stimulus presentation
    - trialized tasks or spontaneous events
    - and many, many more...

## Using the DANDI API in Python

 For finer-grain searchability, we can use the dandi-api to scan the metadata.yml files to programmatically obtain information

On a local installation of Python (preferably in a fresh environment...)

```
pip install dandi jupyter
jupyter notebook
```

Or just open up a notebook on the DANDI Hub

DANDI search tutorials

- Once you have concluded your investigation and found some NWB files of interest, you can either...
  - download them locally via command-line

```
dandi download DANDI:<six-digit-ID> # Will download all files
dandi download <copy and paste individual file URL>
```

#### Then in Python (script or notebook)...

Or

```
from pynwb import NWBHDF5IO

io = NWBHDF5IO(path=".../path_to_single_file.nwb", load_namespaces=True)
nwbfile = io.read()
```

- Once you have concluded your investigation and found some NWB files of interest, you can either...
  - download them locally via command-line

```
dandi download DANDI:<six-digit-ID> # Will download <u>all</u> files
dandi download <copy and paste individual file URL>
```

#### Then in MATLAB...

Or

```
%% With MatNWB downloaded and added to your MATLAB session path...
nwbfile = nwbRead('intro tutorial.nwb')
```

- Once you have concluded your investigation and found some NWB files of interest, you can either...
  - Or stream directly (most recommended for one-off analyses or quick calculations)

#### In Python...

```
import h5py
import fsspec
from fsspec.implementations.cached import CachingFileSystem
from pynwb import NWBHDF5IO

s3_url = "<copy and paste S3 URL from DANDI>" # Or ask the nwbinsector API for it
cfs = CachingFileSystem(
    fs=fsspec.fileSystem("http"), cache_storage="some/temporary/folder",
)
file_system = cfs.open(s3_url, "rb")
file = h5py.File(file_system)
io = NWBHDF5IO(file=file, load_namespaces=True)
nwbfile = io.read()
```

- Once you have concluded your investigation and found some NWB files of interest, you can either...
  - Or stream directly (most recommended for one-off analyses or quick calculations)

#### In MATLAB\*...

```
%% The S3 path must be copy/pasted manually
s3 = 's3://dandiarchive/blobs/7ee/415/7ee41580-9b0b-44ca-8675-6959ddd8dc33'
nwbfile = nwbRead(s3)
```

<sup>\*</sup> streaming speeds are usually much slower than in Python