#### How

# FAIR

## is scientific data?

Supervised by Tibor Šimko

Adam Novoroľník Filip Maxin Radovan Lascsák Ronald Doboš

### Is my data FAIR?

#### Findable

indexed and searchable

#### Accessible

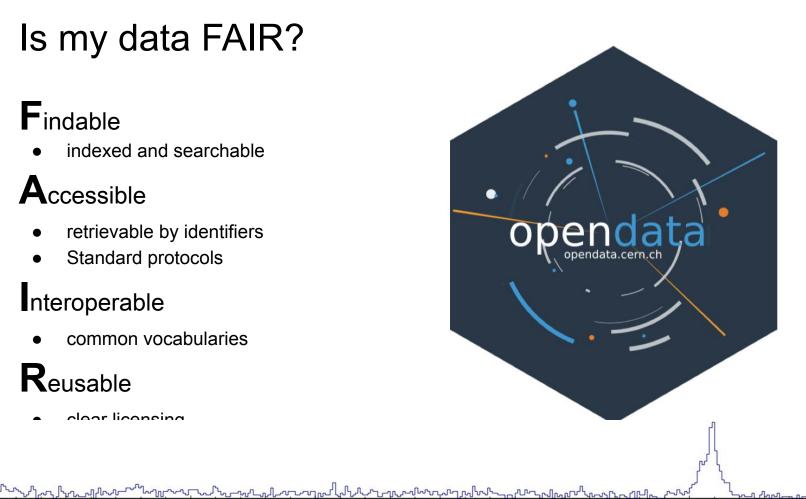
- retrievable by identifiers
- Standard protocols

#### Interoperable

common vocabularies

#### Reusable

clear licensing



#### Necessary tools

- Shell
- Git
- GitHub
- Docker
- Python



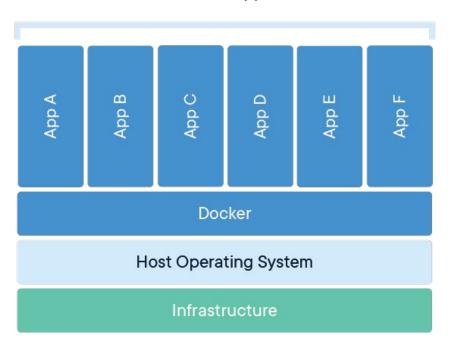


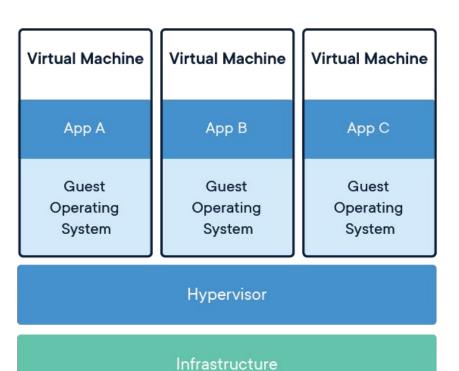


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#### Docker

**Containerized Applications** 







Managing and exposing education and research data from particle physics

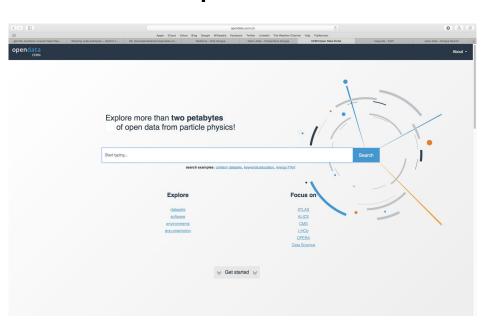
### Why we use open data?

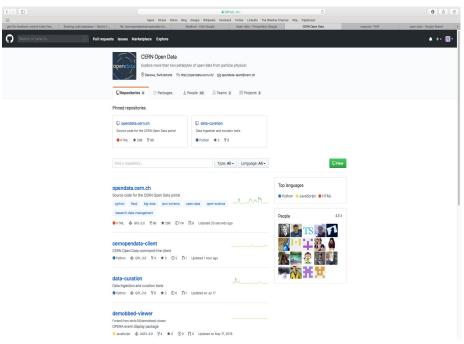
Education

Accessible information

FAIR science

#### How do open data sites look like?



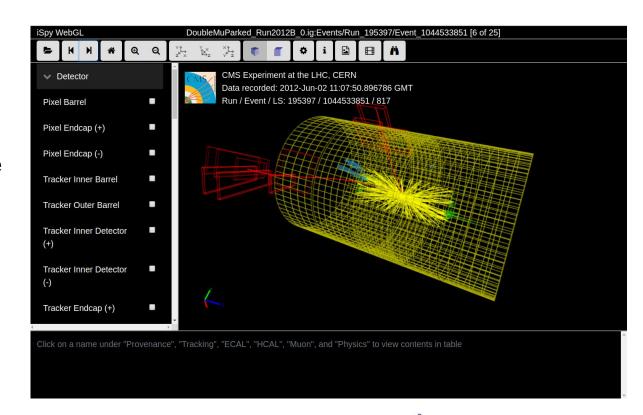


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# What was our job?

#### **Event Display**

 Interactive event simulations available in opendata



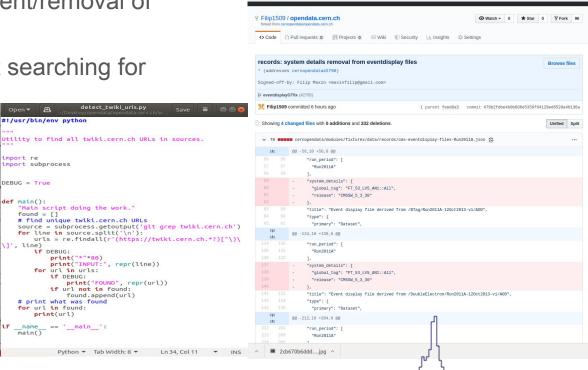
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#### Global tag fix and Twiki URL finder

 Bugfixing: replacement/removal of wrong tags

New features: script searching for

twiki.cern.ch urls



mmit/479b2fdbe4b0b606e5356f94129ed6520a46136a

CERNO, 🗴 🕍 Python : 🗴 🖎 Python i 🗴 👺 subproc 🗴 🛕 Môj disk 🗴 📘 Open-d: 🗴 🔞 ORCID - 🗴 😥 Whats A. 🗴 🙆 githu

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#### Jupyter notebooks and invariant mass

 Dynamic environment to run and understand code in scientific context

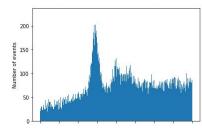
#### 3) Plotting the histogram

Now we can create and plot the histogram of the values of the invariant masses that we got. The histogram shows that in how many events the invariant mass of the muon pair has been in the certain value range. Note that we will use total 500 bins in the histogram, so you won't spot the separate bins because there are so many of them.

```
In [3]: # Plot the histogram with the function hist() of the matplotlib.pyplot module:
    # (http://matplotlib.org/api/pyplot api.html?highlight=matplotlib.pyplot.hist#matplotlib.pyplot.hist).
    # 'Bins' determines the number of the bins used.
    plt.hist(invariant_mass, bins=500)

# Name the axises and give the title.
    plt.xlabel('Invariant mass [GeV]')
    plt.ylabel('Number of events')
    plt.title('The histogram of the invariant masses of two muons \n') # \n creates a new line for making the title loo
    # Show the plot.
    plt.show()
```

The histogram of the invariant masses of two muons





#### Opendata-client

Used in shell

- What can we use it for?
  - cernopendata-client get-file-locations (list of files belonging to a dataset)

get-record (records content by its recid, doi or title..)

Were there any issues?

```
[(base) rokas-macbook:cernopendata-client anovorol$ git branch
   11-git-fix
   11-at-fix
   9-unwind-index-files
   docs-authors
* master
 [(base) rokas-macbook:cernopendata-client anovorol$ git checkout 9-unwind-index-files
 Switched to branch '9-unwind-index-files'
 [(base) rokas-macbook:cernopendata-client anovorol$ git status
 On branch 9-unwind-index-files
 Untracked files:
   (use "git add <file>..." to include in what will be committed)
         .DS Store
 nothing added to commit but untracked files present (use "git add" to track)
 (base) rokas-macbook:cernopendata-client anovorol$ cernopendata-client --help
 Usage: cernopendata-client [OPTIONS] COMMAND [ARGS]...
 Options:
   --help Show this message and exit.
 Commands:
   get-file-locations Get a list of files belonging to a dataset.
   get-record
                       Get records content by its recid, doi or title...
 (base) rokas-macbook:cernopendata-client anovorol$ cernopendata-client get-file-locations --helo
 Usage: cernopendata-client get-file-locations [OPTIONS]
 Try "cernopendata-client get-file-locations --help" for help.
 Error: no such option: --helo
 (base) rokas-macbook:cernopendata-client anovorol$ cernopendata-client get-file-locations --help
 Usage: cernopendata-client get-file-locations [OPTIONS]
   Get a list of files belonging to a dataset.
 Options:
   --recid INTEGER
                           Record ID
                           Digital Object Identifier.
    --doi TEXT
   --title TEXT
                           Record title
   --protocol [root|http] Protocol to be used in links.
   --expand / --no-expand Expand file indexes? [default=yes]
   --help
                           Show this message and exit.
 [(base) rokas-macbook:cernopendata-client anovorol$ cernopendata-client get-file-locations --recid 1 --no-expand
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Aor21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Aor21ReReco-v1 0000 file index.ison
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS_Run2010B_BTau_AOD_Apr21ReReco-v1_0000_file_index.txt
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0001 file index.ison
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0001 file index.txt
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0002 file index.ison
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS_Run2010B_BTau_AOD_Apr21ReReco-v1_0002_file_index.txt
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0003 file index.json
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 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0004 file index.json
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0004 file index.txt
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0005 file index.json
 root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/file-indexes/CMS Run2010B BTau AOD Apr21ReReco-v1 0005 file index.txt
 (base) rokas-macbook:cernopendata-client anovorol$
```

```
root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/0005/E2CC8B41-D071-E011-9E39-0025B3E05D46.root
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root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/0005/F0110DE6-9371-E011-B65F-003048D45F8A.root
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{\tt root://eospublic.cern.ch//eos/opendata/cms/Run2010B/BTau/AOD/Apr21ReReco-v1/0005/FC811BCA-9371-E011-95B9-00E08178C01F.root}
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```

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root://eospublic.cern.ch//eos/opendata/cms/Run20108/BTau/AOD/Apr21ReReco-v1/0005/FE531718-C771-E011-9569-00E08179179B.root

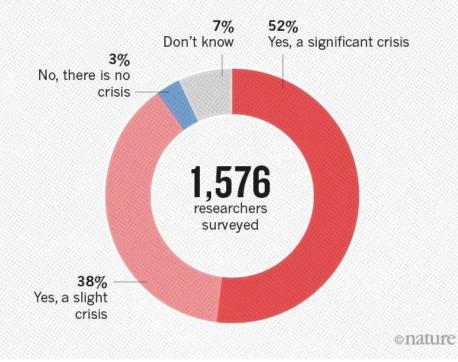
(base) rokas-macbook:cernopendata-client anovorol\$



REusable ANAlyses

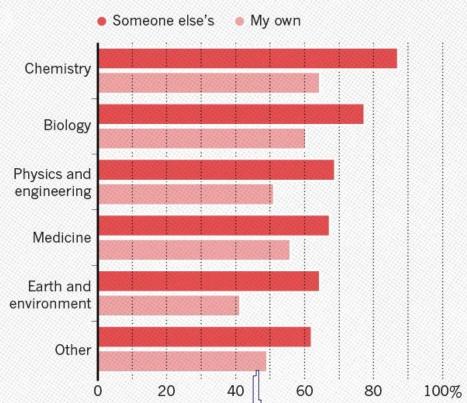


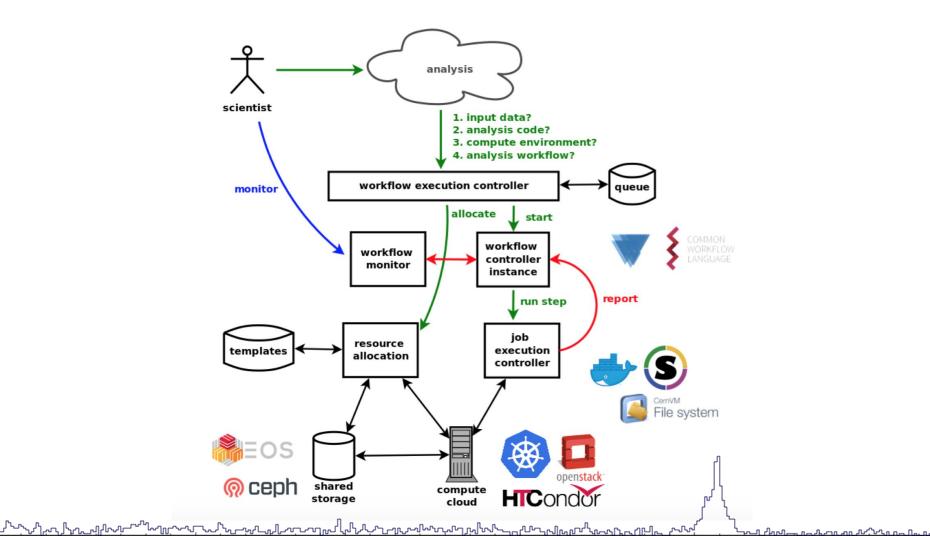
#### IS THERE A REPRODUCIBILITY CRISIS?

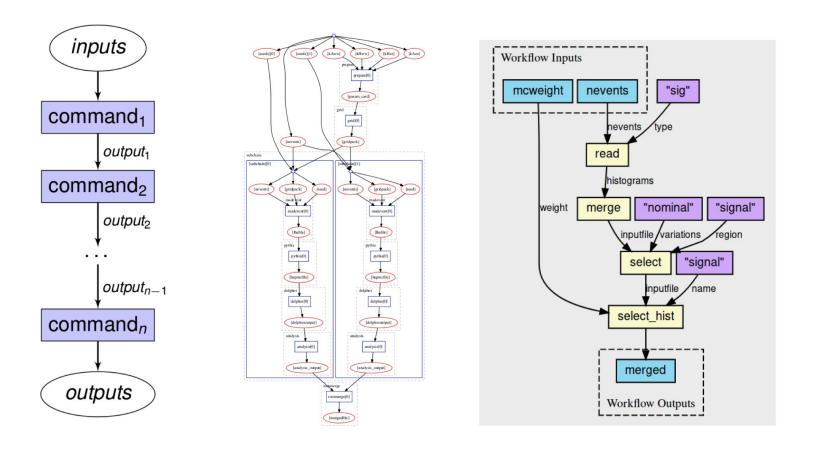


## HAVE YOU FAILED TO REPRODUCE AN EXPERIMENT?

Most scientists have experienced failure to reproduce results.







Serial Yadage CWL

#### Our contribution - REANA example

1. Take data from opendata



- 2. Use existing code to produce dimuon spectrum.
- 3. Containerize the code using docker
- 4. Produce a REANA example on GitHub.

#### **Invariant mass**

$$X \equiv \begin{pmatrix} ct \\ x \\ y \\ z \end{pmatrix}, \quad X' = \Lambda X, \quad ds^2 \equiv dX \cdot dX = c^2(t)^2 - dx^2 - dy^2 - dz^2 \text{ is invariant}$$

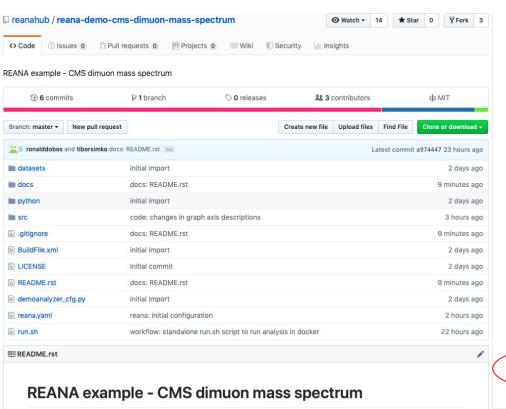
 $ds = cd\tau$ ,  $d\tau = \frac{ds}{c}$  is invariant

$$U \equiv \frac{dX}{d\tau} = \frac{dt}{d\tau} \begin{pmatrix} c \\ \mathbf{u} \end{pmatrix} = \gamma \begin{pmatrix} c \\ \mathbf{u} \end{pmatrix}, \quad U \cdot U = c^2$$

$$P \equiv mU = \begin{pmatrix} m\gamma c \\ m\gamma \mathbf{u} \end{pmatrix} = \begin{pmatrix} E/c \\ \mathbf{p} \end{pmatrix}, \quad P \cdot P = m^2c^2 = (E/c)^2 - \mathbf{p}^2$$

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#### Final result



We start by creating a reana.yaml file describing the above analysis structure with its inputs, code, runtime environment, computational workflow steps and expected outputs:

We can now install the REANA command-line client, run the analysis and download the resulting ROOT file containing plots:

```
$ # create new virtual environment
$ virtualenv ~/.virtualenvs/mvreana
$ source ~/.virtualenvs/myreana/bin/activate
$ # install REANA client
$ pip install reana-client
$ # connect to some REANA cloud instance
$ export REANA_SERVER_URL=https://reana.cern.ch/
$ export REANA ACCESS TOKEN=XXXXXXX
$ # create new workflow
$ reana-client create -n mv-analysis
$ export REANA WORKON=my-analysis
$ # upload input code and data to the workspace
$ reana-client upload
$ # start computational workflow
$ reana-client start
$ # ... should be finished in about 1 minute
$ reana-client status
$ # download output root file with generated plots
$ reana-client download
```

Please see the REANA-Client documentation for more detailed explanation of typical reana-client usage scenarios.

#### Contributors

The list of contributors in alphabetical order:

- Radovan Lascsak
- Ronald Dobos
- Tibor Simko

# Thank you for your attention



Yes I know what REANA means

R - 1

E - have

A - no

N - ídea

A - send help

## Yes I'm HAPPY



2happy4meirl