CERN Open Data portal: preserve to reuse

Tibor Šimko

CERN

Unveiling hidden Physics Beyond the Standard Model at the LHC 1–3 March 2021

https://indico.tlabs.ac.za/event/100

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CERN Open Data portal

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CERN Open Data portal

- launched in November 2014
- rich content
 - collision and simulated datasets for research
 - derived datasets for education
 - configuration files and documentation
 - virtual machines and container images
 - software tools and analysis examples
- ▶ total size in March 2021
 - over 7'600 bibliographic records
 - over 900'000 files
 - over 2.4 petabytes



https://opendata.cern.ch

Developed by CERN in close collaboration with Experiments





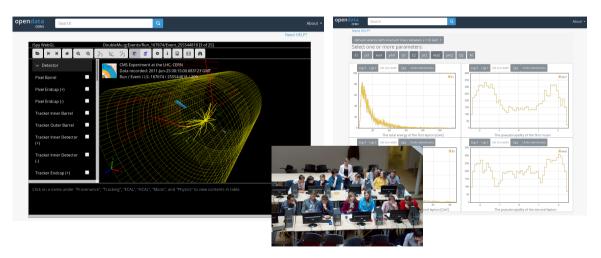






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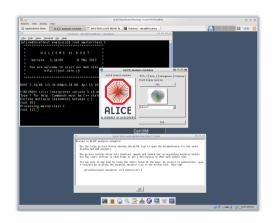
Education-oriented use cases

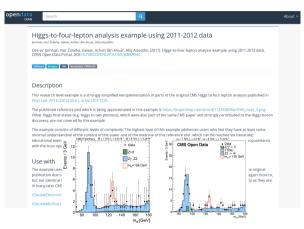


Interactive event display and histogramming for derived datasets

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Research-oriented use cases





Run CernVM Virtual Machines

Run simplified research-level analysis examples

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Latest research-level content news



➤ August 2020 CMS released fifth batch of new open data. All proton-proton collision data recorded in 2010–11 and half of 2012 are available throughout the portal.

https://opendata.cern.ch/docs/cms-completes-2010-2011-pp-data

October 2020 CMS run a CMS Open Data Workshop for Theorists at the LPC.

https://indico.cern.ch/event/882586/

December 2020 CMS released first 2010–11 heavy-ion data samples and reference proton-proton datasets (214 TB).

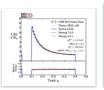
https://opendata.cern.ch/docs/cms-releases-heavy-ion-data

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Enables independent theoretical research











arXiv:1704.05066

arXiv:1807.11916

arXiv:1902.04222

Searches, QCD jet studies, Machine Learning. . .

uXiv:1708.09429v2

A measurement of the $z_{\rm g}$ distribution in pp collisions, using CMS open data, was recently reported [33] [34]. In PbPb collisions, this measurement reflects how the two color-charged parameters are the color-charged parameters.

- [33] A. Larkoski et al., "Exposing the QCD splitting function with CMS Open Data", Phys. Rev. Lett. 119 (2017) 132003, doi:10.1103/PhysRevLett.119.132003, arXiv:1704.05068
- [34] A. Tripathee et al., "Jet Substructure Studies with CMS Open Data", Phys. Rev. D 96 (2017) 074003, doi:10.1103/PhysRevD.96.074003, arXiv:1704.05842

... that the CMS collaboration cites!

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LHC collaboration data preservation and open access policies











Restricted data \rightarrow embargo period (\sim 5 years) \rightarrow open data

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A FAIRy tale

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FAIR guiding principles for scientific data management

Scientific data Explore Content V Journal Information V Publish With Us V nature S scientific data S comment S article Open Access | Published: 15 March 2016 The FAIR Guidling Principles for scientific data management and stewardship Mark D. Wilkinson, Michel Dumontier, [...] Barend Mons El Scientific Data 3, Article number: 160018 (2016) | Cite this article 180k. Accesses | 2306 Citations | 1797 Attrettic | Metrics An Addendum to this article was published on 19 March 2019 Abstract There is an urgent need to improve the infrastructure supporting the reuse of scholarly data.

There is an urgent need to improve the infrastructure supporting the reuse of scholarly data. A diverse set of stakeholders—representing academia, industry, funding agencies, and scholarly publishers—have come together to design and jointly endorse a concise and measureable set of principles that we refer to as the FAIR Data Principles. The intent is that these may act as a guideline for those wishing to enhance the reusability of their data holdings. Distinct from peer initiatives that focus on the human scholar, the FAIR Principles put specific emphasis on enhancing the ability of machines to automatically find and use the data, in addition to supporting its reuse by individuals. This Comment is the first formal publication of the FAIR Principles, and includes the rationale behind them, and some exemplar implementations in the community.

- ► Findable
- Accesible
- Interoperable
- ► **R**eusable

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FAIR principles: F is for Findable

The first step in (re)using data is to find them.

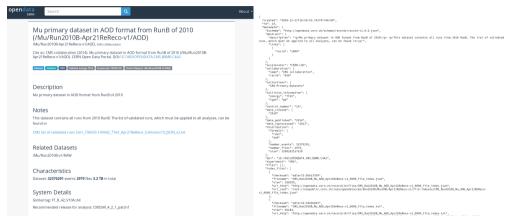
Metadata and data should be easy to find for both humans and computers.

Machine-readable metadata are essential for automatic discovery of datasets and services.

- ▶ F1. (Meta)data are assigned a globally unique and persistent identifier
- ► F2. Data are described with rich metadata (defined by R1 below)
- ▶ F3. Metadata clearly and explicitly include the identifier of the data they describe
- ► F4. (Meta)data are registered or indexed in a searchable resource

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Dataset information: persistent identifiers & machine readability



https://opendata.cern.ch/record/14 = http://doi.org/10.7483/OPENDATA.CMS.B8MR.C4A2

Each dataset is identified by a "record ID" and optionally minted with a DOI

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Dataset information: rich context description & machine readability



https://opendata.cern.ch/record/14 = http://doi.org/10.7483/OPENDATA.CMS.B8MR.C4A2

Rich curated context information on data selection, validation, and use

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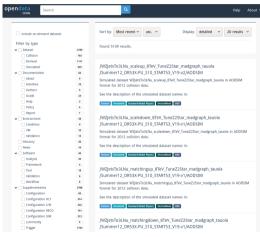
Associated documentation and guides



A detailed guide to CMS global tags and condition database

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Information discovery



"created": "2020-12-21T10:53:13.614056+00:00". "self": "https://opendata.cern.ch/api/records/688" Thursett: 784499887-eTte-4896-8799-230445498411. "key": "BTau.ig", "size": 2676577 "version id": "hdf67431-f22a-de39-8a6f-87a6b3a6372f" "Mescription": "contamble event set from /MIau/Bun30100-Apr210e0ero-v1/800 primary dataset in toom format readable from the browser-based 3d event display/for co-bin "acceterator": "CERN-LHC". Season McCouley Thomas "ercid": "8000-0001-6585-8286" *CMS-Derived-Gatasets* "energy": "TTeV", "type": "po" "date_created": ["date sublished": "2014". "number_events": 25 "do1": "10.7483/OPENDATA.CMS.6D32.GOGR". "experiment": "CMS". Developed: 004400007-4734-4866-6700-3-6444444848411 "5126": 2678377; "ur1": "root://esspublic.cern.ch//ess/opendata/cms/Rus20108/8Tau/IG/Agr21ReReco-v1/8Tau.is". "description": "These files contain the objects to be displayed with the online event display. No event selection, apart from accepting only the validated runs, is applied. The software to produce these files in available in:". *rectd*: *559*

Faceted search interface

Corresponding REST API

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FAIR principles: A is for Accessible

Once the user finds the required data, she/he needs to know how can they be accessed, possibly including authentication and authorisation.

- ► A1. (Meta)data are retrievable by their identifier using a standardised communications protocol
- ▶ A1.1 The protocol is open, free, and universally implementable
- ► A1.2 The protocol allows for an authentication and authorisation procedure, where necessary
- ▶ A2. Metadata are accessible, even when the data are no longer available

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Downloading content



Browsing and downloading files manually



Automated cernopendata-client

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Command-line client

```
/tmp $ cernopendata-client --help
                                                                                                /tmp $ cernopendata-client get-file-locations --recid 5500
                                                                                                http://opendata.cerp.ch/eos/opendata/cms/software/HiggsEvample28112812/BuildFile.vml
Usage: cernopendata-client [OPTIONS] COMMAND [ARGS]...
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/HiggsDemoAnalyzer.cc
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/List_indexfile.txt
  Command-line client for interacting with CERN Open Data portal.
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/M4Lnormdatall.cc
                                                                                                http://opendata.cerp.ch/eos/opendata/cms/software/HiggsExample28112812/M4Lpormdatall lv13.cc
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/demoanalyzer_cfg_level3MC.pv
Ontions:
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/demoanalyzer_cfg_level3data.pv
  --help Show this message and exit.
                                                                                                http://opendata.com.ch/eos/opendata/cms/software/HiggsEvample28112812/demoanalyzer.cfg_level4MC_nv
                                                                                                http://opendata.cerp.ch/eos/opendata/cms/software/HiggsExample20112012/demognalyzer_cfg_level4data.pv
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/mass4l_combine.pdf
Commands:
                                                                                                http://opendata.cern.ch/eos/opendata/cms/software/HiggsExample20112012/mass4l combine.png
  download-files
                          Download data files belonging to a record.
  get-file-locations Get a list of data file locations of a record.
                                                                                                /tmp $ cernopendata-client download-files --recid 5500 --verify
  get-metadata
                          Get metadata content of a record.
                                                                                                ==> Downloading file 1 of 11
                                                                                                  -> File: /5588/BuildFile.vml
  list-directory
                          List contents of a EOSPUBLIC Open Data directory.
                                                                                                  -> Progress: 8/8 KiB (188%)
  verify-files
                          Verify downloaded data file integrity.
                                                                                                ==> Verifying file BuildFile.xml...
  version
                          Return cernopendata-client version.
                                                                                                  -> Expected size 305, found 305
                                                                                                  -> Expected checksum adler32:ff63668a, found adler32:ff63668a
                                                                                                BB> Downloading file 2 of 11
 tmp $ cernopendata-client get-metadata --doi 10.7483/OPENDATA.CMS.ZVT8.MZNV \
                                                                                                 -> File: ./5500/HiggsDemoAnalyzer.cc
          --output-value distribution
                                                                                                  -> Progress: 81/81 KiB (180%)
                                                                                                ==> Verifying file HiggsDemoAnalyzer.cc...
                                                                                                  -> Expected size 83761, found 83761
    "formats": [
                                                                                                  -> Expected checksum adler32:f205f068. found adler32:f205f068
         "aodsim".
                                                                                                ==> Downloading file 3 of 11
         "root"
                                                                                                  -> File: ./5588/List indexfile.txt
                                                                                                  -> Progress: 1/1 KiB (180%)
                                                                                                ==> Verifying file List_indexfile.txt...
     "number events": 30125269.
                                                                                                  -> Expected size 1669, found 1669
    "number files": 26958.
                                                                                                  -> Expected checksum adler32:46a907fc, found adler32:46a907fc
    "size": 9560202852603
                                                                                                ==> Downloading file 4 of 11
                                                                                                  -> File: ./5500/M4Lnormdatall.cc
                                                                                                  -> Progress: 14/14 KiB (180%)
                                                                                                ==> Verifying file M4Lnormdatall.cc...
/tmp $ cernopendata-client get-metadata --doi 10.7483/OPENDATA.CMS.ZVT8.MZNY \
                                                                                                  -> Expected size 14943, found 14943
      --output-value distribution.size
                                                                                                  -> Expected checksum adler32:af301992, found adler32:af301992
                                                                                                ==> Downloading file 5 of 11
9560202852603
```

Downloading metadata information

Downloading and verifying files

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Working with large datasets



A dataset of 9.6 TB size, 26'958 files

```
/tmp $ cernopendata-client download-files --help
Usage: cernopendata-client download-files [OPTIONS]
 Download data files belonging to a record.
 Select a CERN Open Data bibliographic record by a record ID, a DOI, or a
 title and download data files belonging to this record.
 Examples:
   $ cernopendata-client download-files --recid 5500
   $ cernopendata-client download-files --recid 5500 --filter-name BuildFile.xml
   $ cernopendata-client download-files --recid 5500 --filter-regexp py$
   $ cernopendata-client download-files --recid 5500 --filter-range 1-4
   $ cernopendata-client download-files --recid 5500 --filter-range 1-2.5-7
   $ cernopendata-client download-files --recid 5500 --filter-regexp pv --filter-range 1-2
/tmp 1m 4s $ cernopendata-client get-file-locations --recid 8884 | head -3
http://opendata.cern.ch/eos/opendata/cms/MonteCarlo2012/Summer12_DR53X/OCD_Pt
v1/00000/0052F9A9-5EB2-E311-81A9-0026189437ED.root
http://opendata.cern.ch/eos/opendata/cms/MonteCarlo2012/Summer12_DR53X/OCD_Pt_
v1/00000/00BF7DF8-69B2-E311-89E6-003048678E8A.root
http://opendata.cern.ch/eos/opendata/cms/MonteCarlo2012/Summer12_DR53X/OCD_Pt_
v1/00000/020194FC-CAR2-F311-8R3A-003048678R94.root
                 Downloading file locations
/tmp $ cernopendata-client download-files --recid 8884 --filter-range 1
```

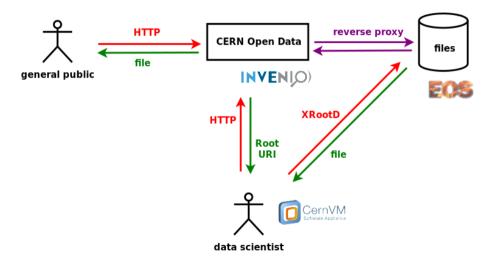
Downloading one file for inspection

-> File: ./8884/0052F9A9-5EB2-E311-81A9-0026189437ED.root

==> Downloading file 1 of 1

-> Progress: 38869/150643 KiB (25%)

Supporting HTTP and XRootD access protocols



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FAIR principles: I is for Interoperable

The data usually need to be integrated with other data. In addition, the data need to interoperate with applications or workflows for analysis, storage, and processing.

- ▶ I1. (Meta)data use a formal, accessible, shared, and broadly applicable language for knowledge representation.
- ▶ I2. (Meta)data use vocabularies that follow FAIR principles
- ▶ 13. (Meta)data include qualified references to other (meta)data

Data formats and vocabularies

Filter by file type		☐ Jpg	1	Filter by category	
_ c	3	json	12	☐ B physics and Quarkonia	17
aod	115	m4v	1	∨ ☐ Exotica	19
aodsim	849	miniaodsim	22	Gravitons	18
СС	11	nanoaod	10	Miscellaneous	1
☐ csv	933	ova	2	✓ ☐ Higgs Physics	338
docx	1	pdf	16	Beyond Standard Model	62
fevtdebughlt	1	png	3	Standard Model Physics Modelling	276
gen-sim	4	py	991		2
gen-sim-digi-raw	1	raw	16	➤ Standard Model Physics	497
gen-sim-reco	6	reco	17	Drell-Yan	
gz	17	root	1126	☐ ElectroWeak ☐ Forward and Small-x QCD Physics ☐ Minimum Bias	39
☐ h5	3	tar	1		133
☐ html	7	tar.gz	1		25
□ Ig	95	txt	28		23
ipynb ipynb	2	xls	1	QCD	143
☐ Jpg	1	xml	6	Top physics	134
☐ Json	12	zip	21	Supersymmetry	3

A variety of data formats ROOT as a community standard

No formal vocabularies Some common classification

Data semantics

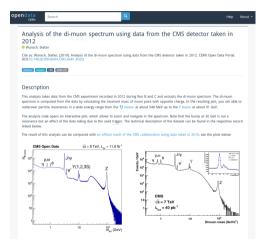




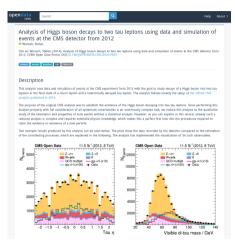
Dataset variables coming with detailed semantics description

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Interoperability via accompanying examples



Dimuon spectrum analysis example



 $H \rightarrow \tau \tau$ analysis example

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FAIR principles: R is for Reusable

The ultimate goal of FAIR is to optimise the reuse of data.

To achieve this, metadata and data should be well-described so that they can be replicated and/or combined in different settings.

- ▶ R1. (Meta)data are richly described with a plurality of accurate and relevant attributes
- ▶ R1.1. (Meta)data are released with a clear and accessible data usage license
- ▶ R1.2. (Meta)data are associated with detailed provenance
- ▶ R1.3. (Meta)data meet domain-relevant community standards

Data provenance: how were the data generated?

Simulated dataset BulkGravTohhTohbbhbb_narrow_M-4500_13TeV-madgraph in MINIAODSIM format for 2016 collision data

/BulkGravTohhTohbbhbb_narrow_M-4500_13TeV-madgraph/RunllSummer16MiniAODv2-

PUMoriond17_80X_mcRun2_asymptotic_2016_TranchelV_v6-v1/MINIAODSIM, CMS Collaboration

Cite as: CMS Collaboration (2019), Simulated dataset BulkGravTohhTohbbhbb_narrow_M-4500_13TeV-madgraph in MINIAODSIM format for 2016 collision data. CERN Open Data Portal, DOI:10.7483/OPENDATA.CMS.7N4X.Z7FA



How were these data generated?

These data were generated in several steps (see also CMS Monte Carlo production overview):

Step LHE

Release: CMSSW_7_1_16

 $Output\ dataset: /BulkGravTohhTohbbhbb_narrow_M-4500_13TeV-madgraph/RunllWinter15wmLHE-MCRUN2_71_V1-V1/LHE$

Note: To get the exact generator parameters, please see Finding the generator parameters,

Step SIM

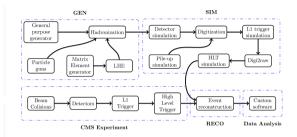
Release: CMSSW_7_1_20

Lack Configuration file for SIM (link)

 $Output\ dataset: /BulkGravTohhTohbbhbb_narrow_M-4500_13TeV-madgraph/RunllSummer15GS-MCRUN2_71_V1-V1/GEN-SIM$

Step HLT RECO

Poloaso: CMSSW 8 0 21



- ▶ full capture of data generation steps
- full capture of compute environments
- full capture of configuration files
- full capture of production scripts

Data records come with full provenance information

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Data provenance is part of the standard JSON metadata

```
"methodology": {
 "description": "These data were generated in several steps (see also <a href=\"/docs/cms-mc-production-overview\">CMS
 "steps": [
      "configuration_files": [
         "script": "#!/bin/bash\nsource /cvmfs/cms.cern.ch/cmsset default.sh\nexport SCRAM ARCH=slc5 amd64 gcc462\nif [ -r
         "title": "Production script"
         "title": "Generator parameters",
          "url": "https://cms-pdmv.cern.ch/mcm/public/restapi/requests/get_fragment/HIG-Summer12-02276"
          "cms confdb id": "a97a2f6c22dfba999c0131657a81ecfd".
          "process": "SIM".
          "title": "Configuration file"
      "generators": [
        "pythia6"
      "global tag": "START53 V7C::All".
      "output dataset": "/BBH_HToTauTau_M_125_TuneZ2star_8TeV_pythia6_tauola/Summer12-START53_V7C-v1/GEN-SIM".
     "release": "CMSSW 5 3 13".
      "type": "SIM"
      "configuration files":
```

CERN Open Data portal standardises CMS DAS/McM information

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Can we reprocess published data samples?

SingleElectron primary dataset sample in RAW format from RunA of 2011 (from /SingleElectron/Run2011A-v1/RAW)

/SingleElectron/Run2011A-v1/RAW, CMS collaboration

Cite as: CMS collaboration (2019). SingleElectron primary dataset sample in RAW format from RunA of 2011 (from /SingleElectron/Run2011A-v1/RAW). CERN Open Data Portal. DOI:10.7483/OPENDATA.CMS.6084.WLN8



Description

A sample from SingleElectron primary dataset in RAW format from RunA of 2011. Run range [161224,163286].

This dataset contains selected runs from 2011 RunA. The list of validated lumi sections, which must be applied to all analyses on events reconstructed from these data, can be found in

CMS list of validated runs Cert_160404-180252_7TeV_ReRecoNov08_Collisions11_JSON.txt

Dataset characteristics

2064298 events. 116 files. 424.3 GB in total.

How can you use these data?

These data are in RAW format and not directly usable in analysis. The reconstructed data reprocessed from these RAW data are included in the data of this record. The reconstruction step can be repeated with the configuration file below and the resulting AOD has been confirmed to be identical with the original one with comparison code available in Validation code to plot basic physics objects from AOD

SingleElectron primary dataset in AOD format from RunA of 2011 (/SingleElectron/Run2011A-12Oct2013-v1/AOD)

/SingleElectron/Run2011A-12Oct2013-v1/AOD, CMS collaboration

Cite as: CMS collaboration (2016). SingleElectron primary dataset in AOD format from RunA of 2011 (/SingleElectron/Run2011A-12Oct2013-v1/AOD). CERN Open Data Portal. DOI:10.7483/OPENDATA.CMS.P87Z.TXTV



Description

 $Single Electron\ primary\ dataset\ in\ AOD\ format\ from\ RunA\ of\ 2011.\ Run\ period\ from\ run\ number\ 160404\ to\ 173692.$

This dataset contains all runs from 2011 RunA. The list of validated runs, which must be applied to all analyses, can be found in

CMS list of validated runs Cert_160404-180252_7TeV_ReRecoNov08_Collisions11_JSON.txt

Dataset characteristics

41709195 events. 1542 files. 5.8 TB in total.

How were these data selected?

Events stored in this primary dataset were selected because of the presence of at least one high-energy electron in the event.

Data taking / HLT

The collision data were assigned to different RAW datasets using the following HLT configuration.

Data processing / RECO

This primary AOD dataset was processed from the RAW dataset by the following step: Step: RECO

Release: CMSSW_5_3_12_patch1

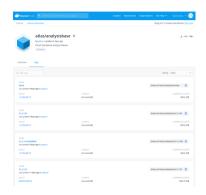
Global tag: FT_R 53 LV5::All

Configuration file for RECO step reco_2011A_SingleElectron





Reprocessing environment: containers



ATLAS collaboration

https://hub.docker.com/r/atlas/analysisbase/tags



CMS collaboration

https://gitlab.cern.ch/cms-cloud/cmssw-docker

Docker and Singularity images help to encapsulate the computing environment

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Reprocessing workflow: computational recipe

3 Workflow 4. Adjust the reconstruction file to the specific data file. Although generated using parameters, the reconstruction file still requires changes. The workflow can be logically divided into several parts: 0. Upload all files. 5 sed -1 "s/process.GlobalTag = GlobalTag/process.GlobalTag. 'FT 53 LV5 AN1::A11', '')/process.GlobalTag Some files cannot be generated at run time and need to be uploaded. 5. Link the CVMES files The Is -I commands are explicitly needed to make sure that the cms-opendata-conddb.cem.ch directory has actually expanded in the image, according to this guide. See also this issue, 5 in asf /cumfs/cms-opendata-conddb.cevs.cb/FT 53 LV5 ANI BUNA FT 53 LV5 ANI 5 in -sf /cymfs/cms-opendata-conddb.cern.ch/FT 53 LV5 AN1 RUNA.db FT 53 LV5 AN1 RUNA.db 1 Fix the CMS SW environment variables manually. First, we have to set up the environment variables accordingly for the CMS SW. Although this is done in the docker image, reana overrides them and they need to be reset. This is done by invoking the cms entrypoint shiscript 6. Run the reconstruction commands At this point all environment variables and files should be proper. See also this issue. \$ source /opt/cms/cmsset default.sh 5 scramyl protect CMSSW CMSSW 5 3 32 7. Adjust project structure for validation Copy the required files for the next steps S eval 'scranvl runtime -sh' 2. Create the specific CMS path. 5 mm --/--/--/ButldFtlm.wml CMS specific data analysis framework requires two directory levels. See also this issue. A see ../../../demonstaturer ofg.nu 8. Run CMS scram command to fix libraries. 5 mkdir Validation && cd Validation Most importantly, the BuildFile xml has to be inside the directory where the screm command is executed 3. Create the reconstruction file. See also this repo. 9 Run the validation file See also this reno \$ cmsDriver.py reco -s RAW2DIGI,L1Reco,RECO,USER:EventFilter/McalRawToDigi/hcallaserhbhehffilter2012 cf 5 cmsRun demoanalyzer cfg.pv

Workflow steps to run CMS reconstruction in CMSSW environment

Four pillars of reusable computational research

I. Input data

What is your input data?

- input files
- input parameters

III. Computing environment

What is your environment?

- operating system
- database calls

II. Analysis code

Which code analyses it?

- user code
- software frameworks

IV. Computational recipes

Which steps did you take?

- shell commands
- notebooks and workflows

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REANA: A platform for reproducible analyses



Home Examples Get Started Documentation News Contact



Reproducible research data analysis platform

Flexible	Scalable	Reusable	Free	
Run many computational workflow engines.	Support for remote compute clouds.	Containerise once, reuse elsewhere. Cloud-native.	Free Software. MIT licence Made with 🎔 at CERN.	
COMMON WORKFLOW LANGUAGE	kubernetes	S	CERN	

http://www.reana.io

Install and run containerised workflows on Kubernetes, HTCondor, Slurm backends

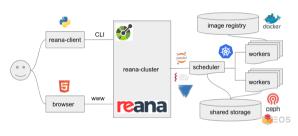
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REANA: Running containerised workflows on remote compute clouds

```
1 vertical 0.68
2 inputs
3 files
4 - skis.ce
4 - skis.ce
5 histograms.py
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5 types serial
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https://github.com/cms-opendata-analyses

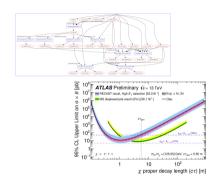
Structure data analysis by means of a reana.yaml file



https://doi.org/10.1051/epjconf/201921406034

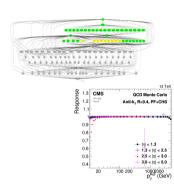
Use command-line and web interfaces to launch analysis on remote compute clusters

Computational recipes: notebooks & workflows



ATLAS http://cdsweb.cern.ch/record/2714064

Data analysis example: ATLAS displaced jet search reinterpretation

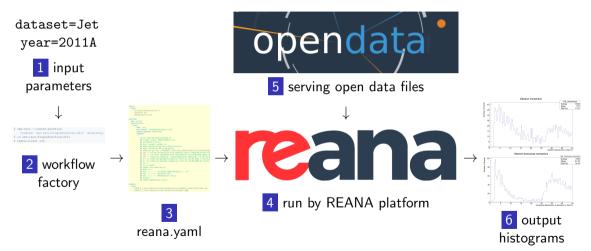


CMS https://github.com/alintulu/reana-demo-JetMETAnalysis

Data production example: CMS jet energy resolution and corrections

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Reprocessing CMS datasets on REANA



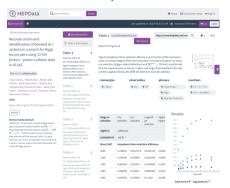
Parametrised workflow runnable on REANA reproducible analysis platform

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An ecosystem of sister data repositories

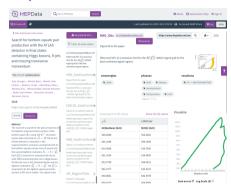
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HEPData widens publication-level data scope



ATLAS collaboration https://www.hepdata.net/record/ins1809175

HEPData provides interactive interface to explore and download publication-level data behind plots and tables

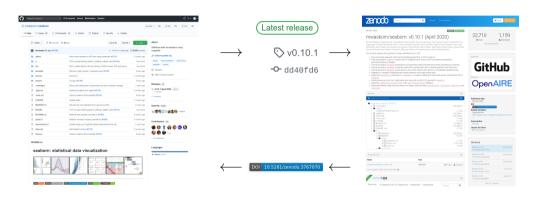


ATLAS collaboration https://www.hepdata.net/record/ins1748602

... now starting to handle more data types: likelihoods!

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Zenodo preserves research software



https://guides.github.com/activities/citable-code

GitHub ↔ Zenodo bridge to automatically preserve releases

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Machine Learning community on Zenodo



Di Florio et al http://opendata.cern.ch/record/12320

Machine-learning related datasets on the CERN Open Data portal



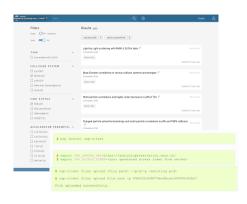
Komiske et al https://zenodo.org/record/3341498

Machine-learning related datasets on Zenodo

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Preserving "restricted" analysis knowledge



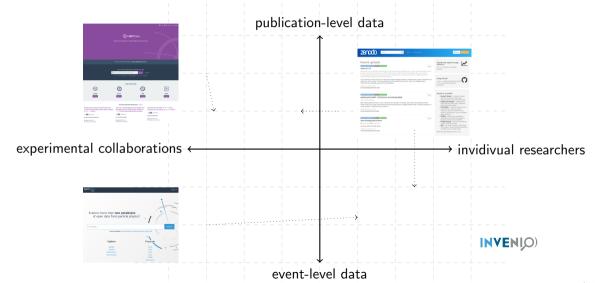


https://analysispreservation.cern.ch

CERN Analysis Preservation framework for collaboration-restricted data. Following the same FAIR principles (FAIR \neq open!)

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A family of digital repositories in movement



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Conclusions

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Fostering FAIR science



CERN Open Data



CERN Analysis Preservation



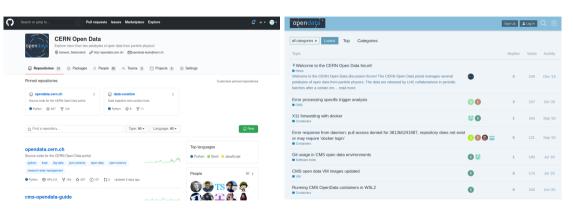
REANA Reusable Analyses

"Capturing and sharing actionable data and knowledge behind particle physics data analyses in order to facilitate future data reuse"

CERN IT A. Mečionis, D. Rodríguez, P. Shandilya, T. Šimko, M. Vidal García · CERN SIS P. Fokianos, I. Koutsakis, K. Naim, A. Papadopoulos · ALICE Y. Foka, M. Gheata, C. Grigoras, M. Zimmermann · ATLAS K. Cranmer, L. Heinrich, A. Sanchez Pineda, D. Rousseau, F. Socher · CMS H. Bittencourt, A. Calderon, E. Carrera, A. Geiser, A. Huffman, C. Lange, K. Lassila-Perini, L. Lloret, T. McCauley, A. Rao, A. Rodriguez Marrero · LHCb S. Amerio, C. Burr, B. Couturier, S. Neubert, C. Parkes, S. Roiser, A. Trisovic · OPERA G. De Lellis, S. Dmitrievsky, G. Galati, A. Ustyuzhanin · HepData A. Clarke, E. Maguire, G. Watt · Invenio L. H. Nielsen, P. Panero · Zenodo F. Decourcelle, A. Ioannidis, G. Lignos · CERN CernVM J. Blomer · CERN EOS L. Mascetti, H. Rousseau · CERN Chen Shift, A. Lossent

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Free open-source solutions



https://github.com/cernopendata/

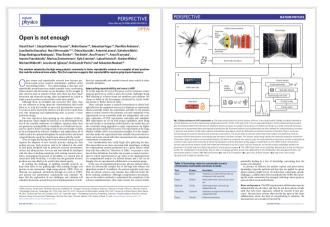
https://opendata-forum.cern.ch

CERN Open Data on GitHub

CERN Open Data user forum

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Open is not enough



- CERN Open Data portal
 - more than 2 petabytes of research-level LHC data
 - enables independent physics research
- Open is not enough
 - importance of runnable usage examples
 - "workflow is the new data"
- ▶ data + code + environment + workflow → data reusability

https://www.nature.com/articles/s41567-018-0342-2.pdf

CERN Open Data portal: future plans

▶ December 2020: A common statement on the open data policy by CERN management and ATLAS, ALICE, CMS, LHCb and TOTEM experiments.

https://opendata.cern.ch/docs/cern-open-data-policy-for-lhc-experiments

- Prepare for forthcoming increase in open data publishing.
- ► Introduce flexible hot/cold disk/tape storage solution. Part of dataset files on disk, part on tapes.
- Simplify ingestion and exposure of experiment datasets (Rucio, Dirac).
- Further automatise provenance testing and usage examples.

CERN announces new open data policy in support of open science

A new open data policy for scientific experiments at the Large Hadron Collider (LHC) will make scientific research more reproducible, accessible, and collaborative

11 DECEMBER, 2020



torage solutions at the CERN data centre (Image: CERN)

Genera, I. December 2000. The four main LHC collaborations (ALCE, ATLAS, CMS and Ut/Ch) have unanimously decembered are one good to apply for scientified reperiments at the Large Harborn Collider (LHC), which was presented to the CERN Council today. The policy commits to publicly releasing to called freed's scientific data, the type required to make scientific studies, collected by the LHC experiments. Data will fast to be released approximately the years after collection, and the aim for the full disables to the publicly available by the close of the operiment concerned. The policy addresses they growing movement of open science, which aims to make scientific research more respectively. Excessible, and collaboration.

The level 3 data released can contribute to scientific research in particle physics, as well as research in the field of scientific computing, for example to improve reconstruction or analysis methods based on machine learning techniques. An approach that requires rich data eres for training and validation.

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