# Facilitating future open data reuse via continuous integration of actionable data analysis examples

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PV2023 conference, Geneva, Switzerland, 2-4 May 2023 https://indico.cern.ch/event/1188041/contributions/5309206/

# **CERN Open Data**

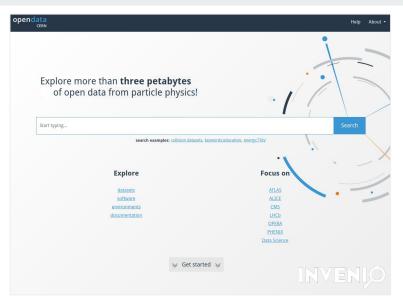
Digital repository for event-level particle physics open data

- collision and simulated datasets for research
- derived datasets for education
- configuration files and documentation
- virtual machines and container images
- software tools and analysis example

Launched in November 2014

Current size (April 2023)

- over 15 000 bibliographic records
- over 1 500 000 files
- over 3 petabytes

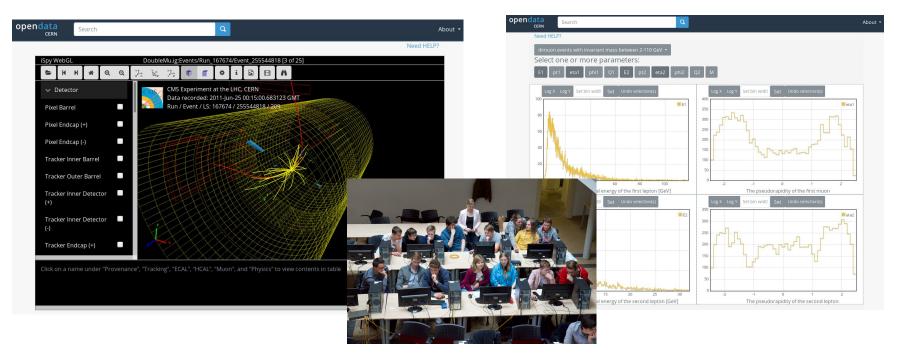


#### https://opendata.cern.ch

Developed by CERN in close collaboration with LHC (and non-LHC!) experiments



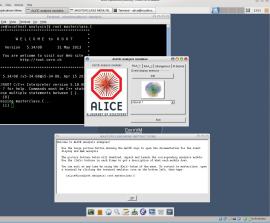
# **Education-oriented use cases**



Interactive collision event displays and basic histogramming from derived datasets

## **Research-oriented use cases**

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Description		
<ul> <li>BjetPlusX primary dataset in AOD format from RunD of 2012.</li> </ul>	Run period from run number 203777 to 208686	
	idated runs, which must be applied to all analyses, can be found in	
CMS list of validated runs Cert_190456-208686_8TeV_22Jan20		
		_
Dataset characteristics		
40926332 events. 3943 files. 14.2 TB in total.	Content metadata	
System details	Content metadata	
Recommended global tag for analysis: FT53_V21A_AN6		
Recommended release for analysis: CMSSW_5_3_32		
How were these data selected?		
Events stored in this primary dataset were selected because	of the presence two or more high-energy jets a b-quark-tag requirement in the eve	ent.
Data taking / HLT		
The collision data were assigned to different RAW datasets us	sing the following HLT configuration.	
Data processing / RECO This primary AOD dataset was processed from the RAW data: Step: RECO	set by the following step:	
Release: CMSSW_5_3_7_patch5		
Global tag: FT_R_53_V18::All Configuration file for RECO step reco_2012D_BjetPlusX		
HLT trigger paths	Provenance metadata	a
The possible HLT trigger paths in this dataset are:		
HLT_DIJet40Eta2p6_BTagIP3DFastPV HLT_DIJet80Eta2p6_BTagIP3DFastPVLoose		
HLT_DIPFJet80_DIPFJet30_BTagCSVd07d05		
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HLT_DIPFJet80_DIPFJet30_BTagCSVd07d05d05		



Run virtual machines and containers with the same physics environment



# CMS open data workshops for research use

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#### Enables independent research

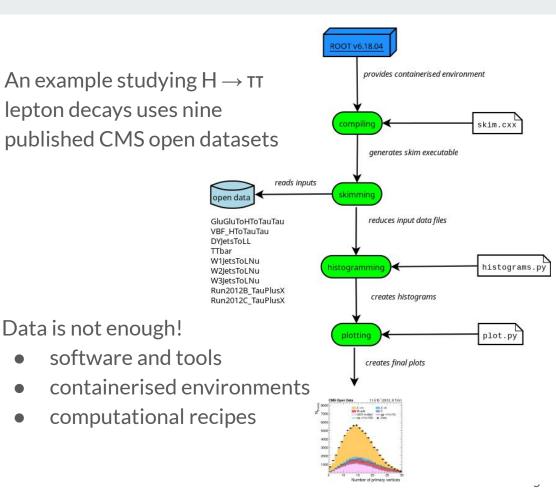
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Explore research-grade primary datasets

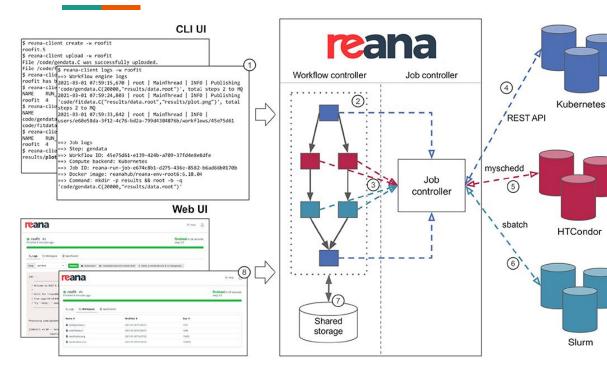
# How to use the data?



Data is accompanied with analysis examples



## **REANA reusable analyses**



Run containerised analysis workflows on the cloud

#### Multiple compute backends:

- Kubernetes
- HTCondor
- Slurm

#### Different workflow languages:

- CWL
- Serial
- Snakemake
- Yadage

Multiple means of use:

- Command-line client
- Web UI

#### https://www.reana.io

# $H \rightarrow \tau \tau$ example running on REANA

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Structure data usage workflow

Cut-flow report (control region): Muon transverse mass out for N+jets suppression: pass=8991 all=8085 -- off=60.15 % cumulative off=80.15 % all=8991 ··· eff=89.25 % cumulative eff=61.72 % 990 ·· eff=1.54 % cumulative eff=8.95 % allutant -- efficit 45 % completive efficit 46 % all=7129 ··· eff=92.85 % cumulative eff=62.64 % all:8562 -- eff:97.84 % cumulative eff:61.19 % 29 all:19492 -- eff:67.95 % cumulative eff:67.95 % all:7129 -- eff:92.85 % cumulative eff:62.54 % 62 -- eff=2.16 N cumulative eff=1.85 N 79 all:23978 -- effrii.59 % cumulative effrii.59 % all=2779 -- eff=90.43 % cumulative eff=10.48 % all:2513 -- eff=77.30 N cumulative eff=8.11 N vorkflow logs 0 8 finished in 6 min 50 sec step 4/4 Size 0 15.55 NB 25T14:59 pt\_vis.prg 11.5 fb<sup>+</sup> (2012, 8 TeV) CMS Open Data 8000 7000 0000 5000 + 4000 20 30 40 50 6 Visible di-tau p \_ / GeV 1 A Developed

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reana

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Step histogramming job: : Pool size: 8

0¢ Engine logs >\_job logs □ Workspace 🕒 Specification

>>> Process skinned sample GluGluToHToTauTau for process ggH

#### Visualise workflow outputs 7

# **Continuous reuse**

Continuous reuse idea:

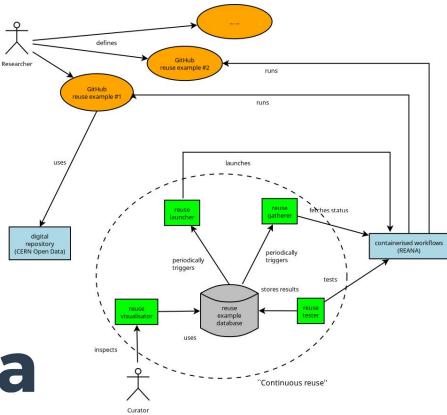
- run data reuse examples periodically
- collect data reuse run information
- test data reuse run outputs
- visualise statistics on a web dashboard

Ensures the accessibility of data and correctness of data reuse examples



"continuous reuse"





### $H \rightarrow \tau \tau$ reuse example tests

Using Gherkin feature files allows data curators to express desired tests in domain-oriented natural language.

Developed tests allowing to check for:

- workspace content
- workspace size
- file sizes
- file checksums
- log content
- job runtime durations

# **User dashboard: Home page**

Grafana dashboard allows to visualise the collected data

- displays a history of various reuse examples and their statistics
- allows to quickly check the last success and failure timestamps
- shows the results of last five runs

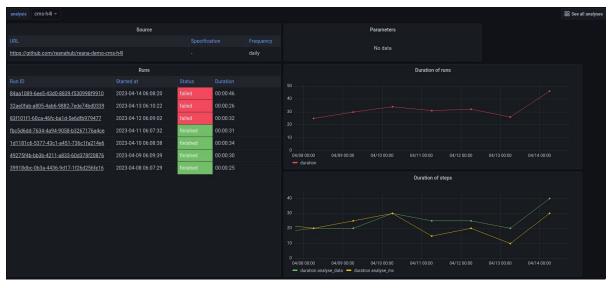
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Name ≁	Last success	Last failure	Last duration			
alice-lego-train-test-run	5 hours ago		00:01:35			
alice-pt-analysis	5 hours ago		00:01:10			
atlas-recast	5 hours ago		00:01:10			
cms-dimuon-mass-spectrum	8 days ago		00:01:03			
cms-dimuon-spectrum	5 hours ago		00:01:22			
cms-dimuon-spectrum-nanoaod	5 hours ago		00:01:52			
cms-h4l	5 hours ago	2 days ago	00:02:02			
cms-h4l-nanoaod	5 hours ago		00:03:46			
cms-htautau-nanoaod	5 hours ago		00:07:08			

Continuous reuse dashboard home page showing the overall status of reuse analyses

## User dashboard: Detailed view

Another dashboard view offers detailed information about one particular data reuse example

- shows the overall success/failure statistics over time
- displays the duration of runs and individual steps in easily readable charts
- enables early detection of performance issues



The detailed page of the dashboard for one particular reuse example

### Conclusions

- Adding value to preserved data through actionable containerised workflows!
  - o containers allow to encapsulate the original computing environment around the data
  - o data production workflows allow to verify the data provenance information
  - data usage workflows allow to understand the data reuse through concrete examples
- "Continuous reuse" helps to discover problems early
  - $\circ \quad \ \ \text{accessibility and readability of data across time}$
  - validity of data usage examples across time
  - discover side issues due to changing versions of software protocols etc

"adaptable software examples [are] the most efficient way to pass on the knowledge needed for research-level studies on these data" — CMS

- Actionable data usage examples help to pass the data knowledge to future generations
- Data + Code + Environments + Workflows = Reusable Knowledge

