EXPLORE: A Scalable Infrastructure for LHC Open Data Analysis and FAIR Data Provisioning

Baida Achkar*, Arnulf Quadt, Sebastian Wozniewski Georg-August-Universität Göttingen

* Corresponding author: baida.achkar@phys.uni-goettingen.de PUNCHLunch Online Seminar

18.09.2025 - 12:30-13:30





Part I – Motivation & Concept

Why EXPLORE? Lowering barriers to LHC Open Data

Why EXPLORE? Barriers to Public Use of LHC Open Data



Technical Barriers



Specialized High Energy Physics (HEP) software & tools required to handle ROOT-format multi-GB datasets efficiently.

Limited runtime & computing resources constrain online analysis environments (e.g. SWAN, Binder).

CERN credentials required to access certain advanced tools (e.g. EOS storage, SWAN).

Obscure & complex interfaces make data access & analysis tools difficult for non-experts to use.

Why EXPLORE? Overcoming Barriers to Public Use of Open Data

EXPLORE's Role

Outcome with EXPLORE



Technical Solution:

Ready-to-use containers with ROOT, libraries, & dependencies (No local install).

Batch mode on EXPLORE's distributed computing (GoeGrid Cluster) enables large-scale analyses.



Access Solution:

No CERN account required to use computing resources or access datasets & tutorials.

Preconfigured remote data access inside job containers (no manual setup).

Enables public & unaffiliated scientists to run real analyses without hardware, credential, or setup hurdles.

Provides researchers & educators a readyto-use environment for both training & research.

Supports compute-heavy LHC analyses.

Serves as a bridge from Open Data in theory to Open Data in practice.

EXPLORE within PUNCH4NFDI & Göttingen GoeGrid

EXPLORE, part of **PUNCH4NFDI** initiative, promoting crossdisciplinary **FAIR** data practices in physics.

GoeGrid, a Tier-2 WLCG site at the University of Göttingen, historically serving ATLAS Monte Carlo production & analysis.



part of GoeGrid as
"Open Analysis
Resources" to serve
non-affiliated users.

This enables LHC Open Data analysis without the need for direct CERN/Institution affiliation.



EXPLORE leverages Göttingen's computing resources, as **Open Analysis Resources**, enabling **LHC–CERN Open Data analysis** without requiring CERN or institutional affiliation.

EXPLORE Objectives

Bridging Open Data from theory to practice

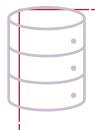


Accessibility: Lower barriers for non-CERN & non-PUNCH users to access & analyze HEP data.



Education & Outreach:
Provide hands-on LHC Open
Data experience for high-

school students, educators.



Scalability: Support diverse workloads with dynamic resource allocation.



FAIR Principles: Ensure data & tools are Findable, Accessible, Interoperable, and Reusable.

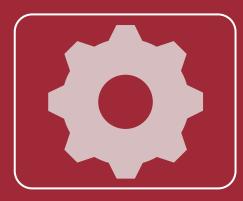


Sustainability: Leverage existing infrastructure with minimal overhead.

Part II – Infrastructure & Operation

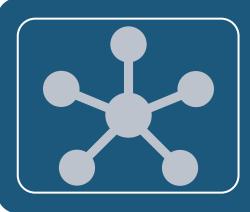
How EXPLORE works: batch system, containers, and monitoring!

Scalable Infrastructure for FAIR Open Data Analysis: Core Components



HTCondor Overlay Batch System (OBS):

 Aggregates distributed compute resources from GoeGrid Cluster into a unified job execution pool with dynamic scheduling.



Dynamic Resource Management (COBalD/TARDIS):

 Continuously monitors real-time workload demands & coordinates automatic scaling of compute resources to ensure optimal performance & cost-efficiency

Drone Architecture & Environments

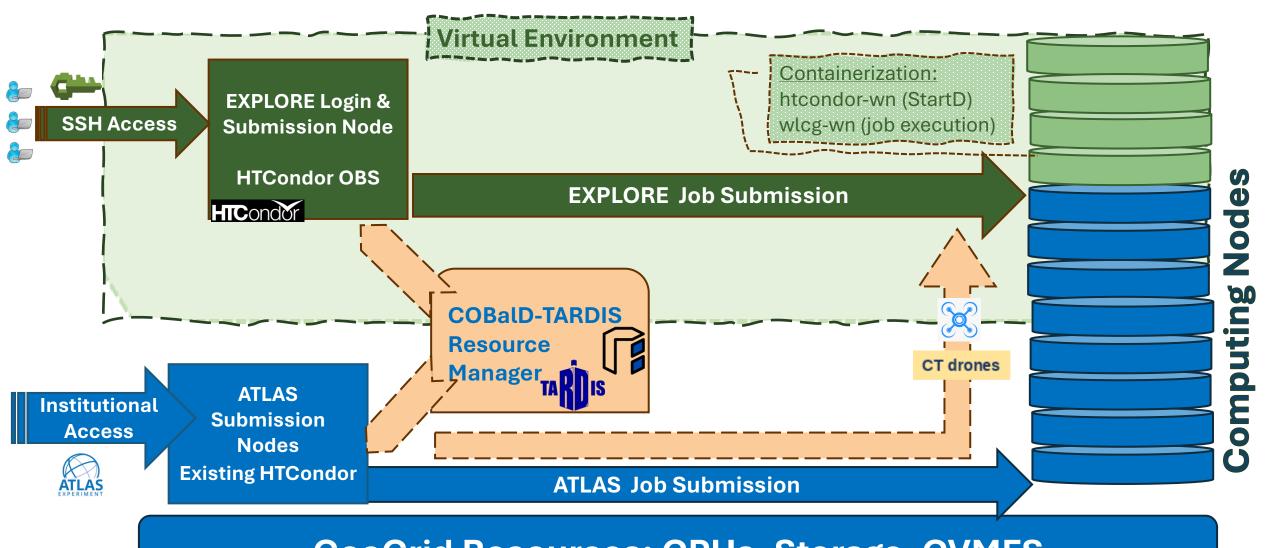
Drone Architecture & Scheduling:

- Placeholder jobs ("drones") submitted, each runs an HTCondor StartD daemon & automatically registers as a Worker Node.
- Drones integrate into the OBS, forming a seamless, unified execution pool.
- HTCondor Scheduler (Schedd) manages job queuing, matching, & dispatch across dynamically provisioned resources, pairing queued jobs with available drones for efficient execution.

Drone Environments:

 Version-controlled containerized setups with ROOT, libraries, and dependencies, deployed dynamically at runtime for reproducibility using HTCondor tools.

EXPLORE setup within GoeGrid cluster-Göttingen



GoeGrid Resources: CPUs, Storage, CVMFS

Software Environment Provisioning



Containerized Analysis Environments with Apptainer & CERN CVMFS provide standardized setups.



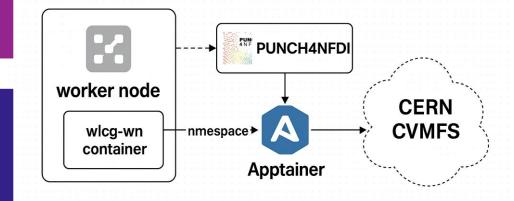
Jobs run inside wlcg-wn Apptainer container, defined in PUNCH4NFDI Container Registry, delivered unpacked via CVMFS.



CVMFS (CernVM File System):

Installed on all GoeGrid worker nodes.

Mounted via namespace to each drone (HTCondor-wn).





Automatic setup: HTCondor job configuration specifies the container, triggering retrieval & environment initialization at runtime.

Real-Time Monitoring with Prometheus & Grafana



Prometheus collects & stores real-time metrics from EXPLORE's Access/Submit Node.

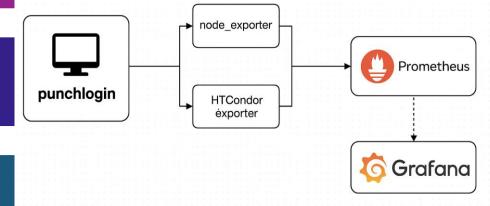


Node_exporter gathers:

CPU, Memory utilization, Disk I/O, Network stats,...



Custom HTCondor exporter configured to track HTCondor metrics (queue status, execution stats,..)



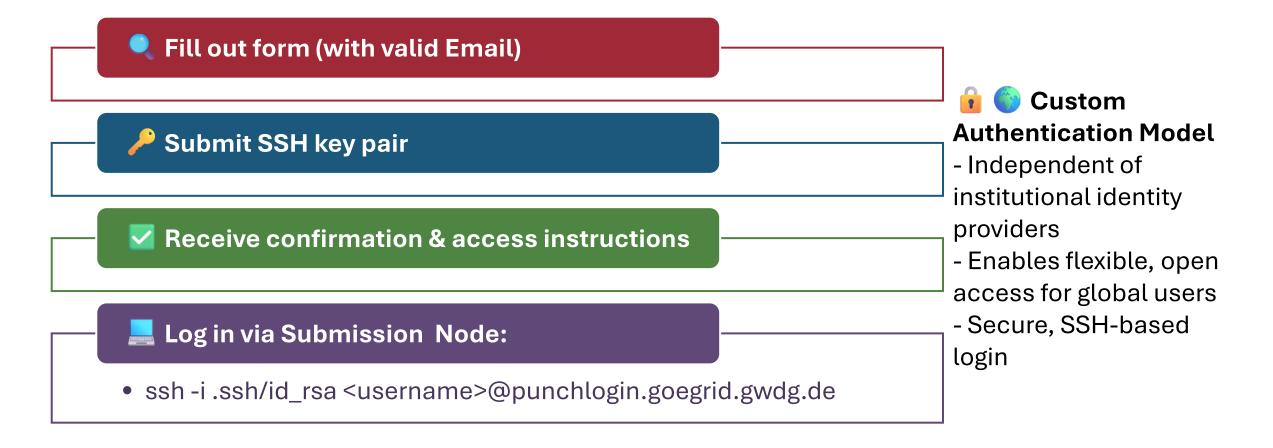


Grafana provides the visualization layer:

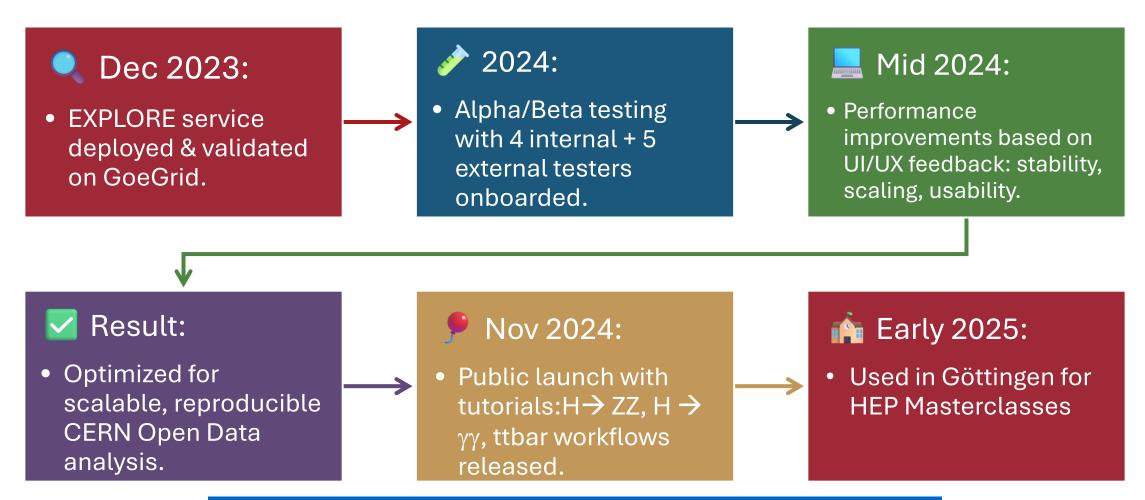
Real-time dashboards for system health & HTCondor performance

→ Proactive monitoring and issue detection

Registration Workflow & User Access



From Prototype to Production: EXPLORE Adoption Journey



Part III – Showcase: tt Analysis

Case study: demonstrating EXPLORE capabilities with ATLAS Open Data!

Why tt? Physics Motivation - l+jets Channel

Top-antitop (tt) production is a key process at LHC:

- Test the Standard Model (QCD at high energies)
- Search for new physics beyond the SM
- Background for Higgs and BSM studies

Educational value:

- Realistic yet manageable complexity
- Rich variety of physics objects: leptons, jets, MET
- Ideal for teaching event selection, reconstruction, and statistical analysis

The l+jets Channel: Channel: 24 jets (2 b-jets, 2 from W → qq') Missing transverse energy (ν from W → ℓν) Large statistics, clean event signature Balance between complexity and yield

Dataset:

From ATLAS Open Data 2025 Beta Release (>100M events across samples)

Includes MC simulations for validation and comparison

This analysis is implemented on EXPLORE-GoeGrid resources to demonstrate the platform's ability to process large datasets efficiently, reproducibly, and at scale.

ATLAS Open Data 2025 Beta

Released: February 2025

Release Overview

↑ > 13 TeV (2025 Beta Release)

• 36 fb⁻¹ of pp collisions at √s = 13 TeV (2015– 2016)

For Education &
 Outreach, largest
 ATLAS educational
 release to date

 Provided as flat ROOT Ntuples (~80 branches) for ease of use Includes real collision data and Monte Carlo simulations

 Fully calibrated and ready for analysis

Analysis notebooks

C++ framework

Convert your code to the 2025 beta release

Welcome to the tutorial page for the 2025 13 TeV beta release. Please, start by choosing your enviroment and continue as needed.

The V (2016 Release)

About us FAQs What's New Contact us

https://opendata.atlas.cern/docs/category/13-tev-2025-beta-release

ATLAS Open Data

Q Search

ATLAS Open Data & EXPLORE: Complementary Tools for Education and

Research





- Developed by the ATLAS Open Data group
- Designed for teaching and outreach
- Runs in interactive environments: CERN SWAN, Google Colab, Binder
- Ideal for small datasets and quick demonstrations
- Supports Python/C++ with ROOT libraries
- Covers Higgs, Z bosons, top quarks, W bosons, etc.
- Purpose: Learn concepts, data formats, analysis basics

EXPLORE Service

(Batch / Large-scale Analysis)



- Provided by Göttingen computing resources (GoeGrid
 → Emmy HPC by 2030)
- Designed for large datasets and complex workflows
- Uses HTCondor batch submission, no interactive execution
- Pre-configured environment and software stack for LHC analysis
- Scales to many CPU cores and long jobs without local setup
- Purpose: Realistic, high-statistics research-grade analyses

Workflow Summary & Execution

- Analysis: TTbarAnalysis (lepton + jets channel) based on C++ framework (latest)
- Data: <u>ATLAS Open Data 2025 Beta release</u>
- Platform: <u>EXPLORE service</u> HTCondor Overlay Batch System
- Environment: <u>punch4nfdi/wlcg-wn</u> container with XRootD-based data access
- Scripts: Executable & Job description file for HTCondor submission
- Submission: 1 sample per job, 58 jobs in parallel
- ✓ All 58 jobs completed successfully
- ✓ First complete workflow validated for EXPLORE using the 2025 Beta release
- ✓ Added to the EXPLORE material/resources portfolio



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Quantitative Job Summary

Total jobs: 58, 35 Jobs with analyzed events ≥ 1,000,000

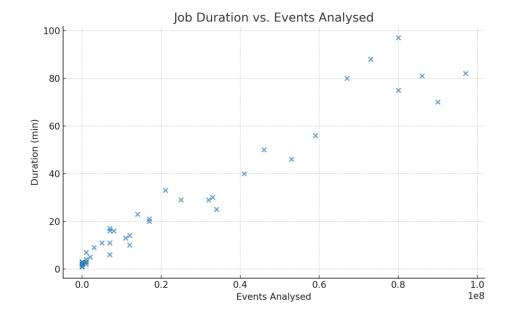
Jobs with <1,000,000 events: 23 (shown as 0)

Average duration: 20.0 min, Duration range: 1 to 97 min

Event range: 1,000,000 to 97,000,000 events

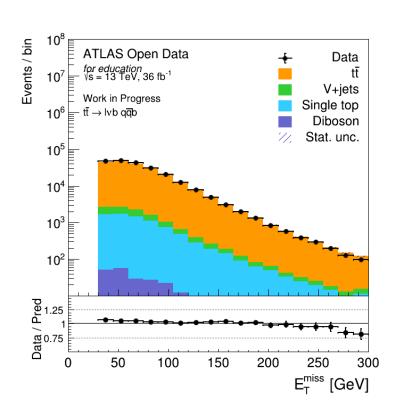
Outputs stored on EXPLORE storage (User's home directory)

Output includes histograms(396K) and ROOT files (1.1M)

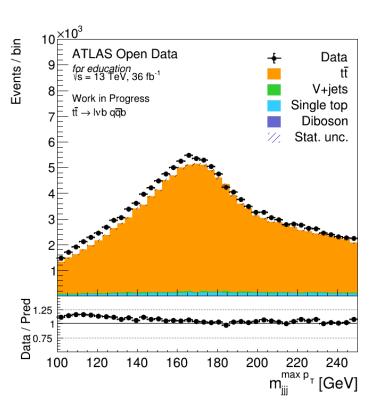


Top-Antitop Analysis Plots

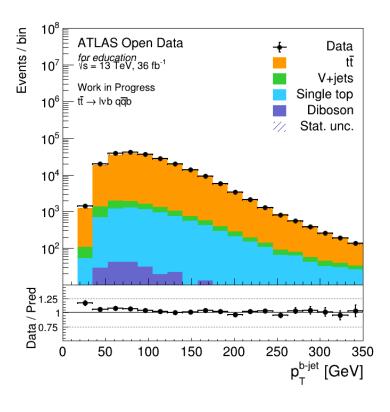
Missing transverse energy



Invariant mass of the three leading jets



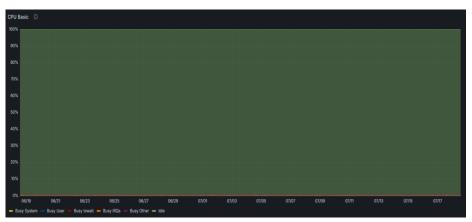
Transverse momentum of the leading b-jet



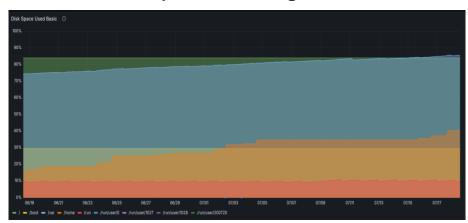
Part IV – Operational Insights & Outreach

What we learned: usage, performance, dissemination!

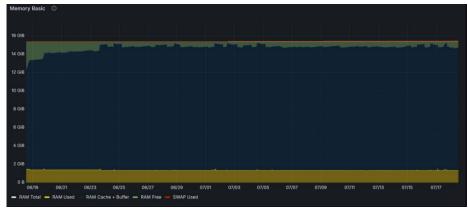
Submit Node Resource Footprint (CPU, Memory, Disk, Network)



CPU: efficient job scheduling and no overloads.



Disk: growing gradually, as users run jobs and store outputs.



Memory: stability across time.

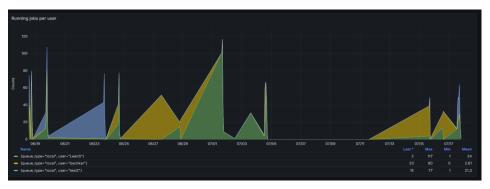


Network traffic: healthy data transfer with occasional peaks, reflecting data access bursts.

Preliminary Usage Statistics & Operational Insights

- Registration Page: ~200 visitor
- Users: 14 (students from different fields, scientists)
- Total Clusters Submitted @EXPLORE Access Point: ~4,000
- Jobs per Cluster: 9 to 33 (varies by workflow)
- **Estimated Total Jobs**: ~36,000 to 132,000
- **Design**: Modular & parallel job execution = scalable performance
- **Datasets**: 130 real ATLAS data samples made available!
- Key Insight: User feedback has shaped UI, documentation, and system stability





Promotional Contribution: EXPLORE Dissemination



ATLAS Open Data Weekly Meetings

Regular service updates to the collaboration

Key contributions:

- •July 18, 2024
- •December 12, 2024



ATLAS Week Outreach

Outreach Parallel Session

Speaker: Miguel Ángel García Ruíz (for ATLAS Open Data team)

February 19, 2025

Link



Advertising & Outreach

- PUNCH4NFDI Website.
- NFDI Newsletters.
- GAU Newsletters
- DPG Meetings
- Email/Letter Campaigns: Targeting Lower Saxony High Schools (# 59 Gymnasien) to expand accessibility.



Conference Contributions

CoRDI 2025 (Conference on Research Data Infrastructure)

Aachen, August 26–28, 2025

- Abstract





Part V – Conclusion & Impact

Takeaways: from open data in theory to open science in practice!

Conclusion & Impact

Conclusion

- EXPLORE removes long-standing technical and access barriers to ATLAS Open Data.
- By eliminating the need for CERN or university credentials, it opens participation to high school students, educators, and independent researchers.
- Ready-to-use containers, distributed computing, and remote data access make real analyses possible without specialist infrastructure.

Impact for Target Users

- High School & University Students: Early exposure to real HEP data and analysis workflows.
- Educators: Ready-made environment for teaching particle physics data analysis.
- Researchers Without Institutional Affiliation: Access to computing resources and datasets without credential barriers.

Key Takeaways – EXPLORE Service

- ✓ Simplifies complex technical setups into accessible, batch-based workflows.
- ✓ Supports compute-heavy analyses beyond online service limits.
- ✓ Acts as a bridge between Open Data in theory and practical, handson analysis.
- ✓ Positions LHC Open Data as an inclusive resource for education, outreach, and independent research.

Part VI – Future Scope

Sustainability & Integration of EXPLORE into PUNCH-2.0

Migration & Integration Roadmap

Transition contingent on PUNCH-2.0 approval & funding

- EXPLORE @ GoeGrid → phase-out by 2030
- Transition to NHR EMMY (GWDG Göttingen, NHR Alliance)
 - Provided PUNCH-2.0 gets approved and funded..
- Ensures:
 - Scalability national HPC resources
 - Sustainability long-term, federated ops
 - Integration PUNCH-2.0 & FAIR ecosystem



Towards Inclusive & Sustainable Access

AAI migration contingent on new features for unaffiliated & under-18 users

- Migration to PUNCH AAI infrastructure
 - Provided AAI extensions for unaffiliated & young users are implemented
- Requirements before migration:
 - **Email validation** for unaffiliated users
 - Parental consent & GDPR compliance for <18
- Renewable accounts beyond 3-month limit

Goal: EXPLORE accessible via PUNCH Portal → lasting, open entry point to LHC Open Data





Time for Questions

THANK YOU

Acknowledgements

This work was [in part] supported by DFG fund "NFDI 39/1" for the PUNCH4NFDI consortium.



Funded by

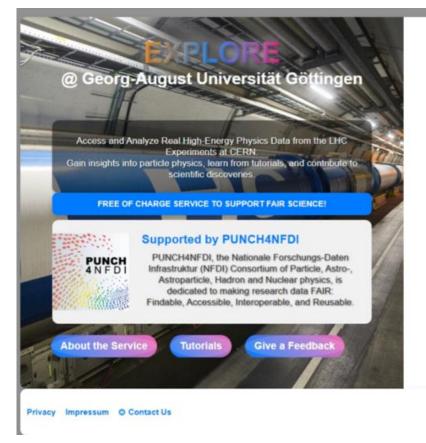
Deutsche
Forschungsgemeinschaft

German Research Foundation

Backup

EXPLORE: A Scalable Infrastructure for LHC Open Data Analysis and FAIR Data Provisioning

Access and Analyze LHC
Open Data Using
EXPLORE-GoeGrid
Resources for All Users

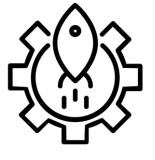








EXPLORE Service @ GAU Göttingen Promoting!



ATLAS Week & Open Data Weekly Meetings

- ATLAS Open Data Weekly Meetings: Regular Updates
 - Contribution on 18.07.2024
 - Contribution on 12.12.2024
- ATLAS Week Outreach: The service was presented during the ATLAS Week Outreach parallel session (Speaker: Miguel Ángel García Ruíz on behalf of the ATLAS Open Data team).
- ATLAS WEEK Outreach Parallel Session February 19, 2025

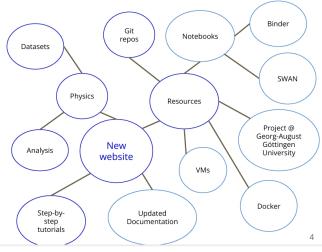
Advertising & Outreach

- GAU Newsletters: Promoting the service within academic networks (Approximately 2,000 recipients.).
- Email/Letter Campaign: Targeting Lower Saxony High Schools (# 59 Gymnasien) to expand accessibility.

Resources and infrastructure

The 8 and 13 TeV documentation, analyses and tools have been collected into a single website https://opendata.atlas.cern/

- Open Data is widely used by institutions (schools, universities) and individuals for learning analysis techniques in experimental particle physics.
- Different environments are provided to suit different needs.
- Accessibility to many different resources (cloud services like SWAN, Binder or ATLAS Open Data Project @ Georg-August Göttingen University).
- Documentation with different levels of complexity for different levels of knowledge.



New release of ATLAS open data

- ATLAS Open Data for Research
 - Particularly useful for theoreticians but not only
 - DAOD_PHYSLITE format 2015-2016 Open Data for Research
 - CERN Open Data Portal. DOI:10.7483/OPENDATA.ATLAS.9HK7.P5SI
 - There are 3 publications referring to these data
 - Dataset characteristics: 9'058'437'931 events. 70'611 files. 65.3 TiB in total.
 - A <u>framework</u> allows processing the research data for analysis, see also <u>Zenodo</u>

PHYSLITE format:

- designed to efficiently manage and analyze large datasets generated in ATLAS at high LHC luminosities
- same format (ROOT xAOD) as all reconstructed data & simulations from the experiment

Heavy Ion data stored as DAOD_HION14 (similar to PHYSLITE)

New release of ATLAS open data

- ATLAS Open data for education
 - ROOT ntuple format 2015-2016 proton-proton Open Data for Education and Outreach beta release from the ATLAS experiment
 - A <u>framework</u> allows processing the research data to produce ROOT ntuples, see also <u>Zenodo</u>
 - CERN Open Data Portal. DOI:10.7483/OPENDATA.ATLAS.B5M9.44TN
 - Dataset characteristics: 9'837'961'169 events, 4668 files, 2.5 TiB in total.

Open Data for Education and Outreach

The

Open Data for research release

Open Data for E&O release

Skimmed samples selecting dedicated final states

- Total: 65 TB
 - 36 fb⁻¹ of data recorded in 2015 and 2016
 - 2 billions of simulated events
- Data format: <u>PHYSLITE</u>

- Total: 2 TB
- Research samples with only very basic cuts such as event cleaning, good run lists, overlap removal, ... 36 fb⁻¹ of data recorded in 2015 and 2016
- Data format: ROOT Ntuples

- Selected data samples
 from ~1.5 GB to ~350 GB
- Targeted analyses
- Data format: ROOT
 Ntuples

Datasets available for Open Data for Education

- Several final-state collections specifically tailored towards physics analysis example notebooks
- Original full 36 fb⁻¹ samples are also available

Latest releases of ATLAS Open Data for Education and Research by Prof. Farid Ould-Saada (University of Oslo (NO) at The fourth African Conference of Fundamental and Applied Physics, ACP2025, will be a hybrid event, jointly organized by ASP and the University of Lomé, Togo, from September 14 to 20, 2025: https://indico.cern.ch/event/1458227/

| Selection | Collection Name |
|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------|
| At least one lepton with at least $7~{\rm GeV}$ of p_T and $30~{\rm GeV}$ of missing transverse momentum (i.e. a leptonically-decaying W-boson enhanced selection) | 1LMET30 |
| Two to four leptons with at least 7 GeV of p_T each | 2to4lep |
| At least two muons with at least $10~{ m GeV}$ of p_T (i.e. a leptonically-decaying Z-boson enhanced selection) | 2muons |
| At least three jets with at least 20 GeV of p_T , at least one lepton passing tight identification requirements with at least 7 GeV of p_T , and 30 GeV of missing transverse momentum (i.e. a semi-leptonic top-quark enhanced selection) | 3J1LMET30 |
| At least two photons with at least $25~{ m GeV}$ of p_T each (i.e. a Higgs boson decaying to two photons enhanced selection) | GamGam |
| At least two jets with at least 20 GeV of p_T , at least two leptons passing tight identification requirements with at least 7 GeV of p_T , and 30 GeV of missing transverse momentum (i.e. a di-leptonic top-quark enhanced selection) | 2J2LMET30 |
| At least two jets with at least 20 GeV of p_T identified as containing at least one heavy flavor hadron using the 70% working point (i.e. a Higgs boson decaying to b-quarks enhanced selection) | 2bjets |
| At least three leptons with at least 7 GeV of p_T each | 3lep |
| Exactly three leptons with at least 7 GeV of p_T (i.e. a leptonically-decaying W+Z boson enhanced selection) | exactly3lep |
| At least four leptons with at least 7 GeV of p_T each | 4lep |
| Exactly four leptons with at least 7 GeV of p_T (i.e. a leptonically-decaying ZZ boson or Higgs to four leptons enhanced selection) | exactly4lep |
| ata for Research and Education & Outreach | 11 |

Tutorials, Repositories, and Analysis Framework

Public GitLab Repository

Hosts code, frameworks, and step-by-step analysis guides

Pre-built Analysis Templates:

HZZ, TTbar, Hyy

C++ framework with ready-made scripts

Guides Included:

- Accessing ATLAS Open Data Portal
- Running analysis scripts
- Plotting & interpreting results

Educational Focus:

Tailored for both novices and experienced users

