A person's hand is holding a white disposable coffee cup with a black lid. The background is a blurred indoor setting.

Start your day with a cup of  
**CMS open data**

# How do I take my cup of CMS Open Data?

Rikab Gambhir

Available at a computer near you!

Photo by [Kelly Sikkema](#) on [Unsplash](#)

I like my **CMS**  
**Open Data** like I  
like my coffee ...

Start your day with a cup of  
**CMS open data**

Available at a computer near you!

Photo by [Kelly Sikkema](#) on [Unsplash](#)

# I like my **CMS** **Open Data** like I like my coffee ...

- Very easily accessible anywhere I am
- Takes only a few seconds to minutes to set up
- Highly preprocessed and prepackaged
- Don't have to understand all the details of how it was made
- Helps me make plots
- Can order online
- Made by somebody else
- Contains flavor information

Admittedly, the last few are a stretch

## Start your day with a cup of **CMS open data**

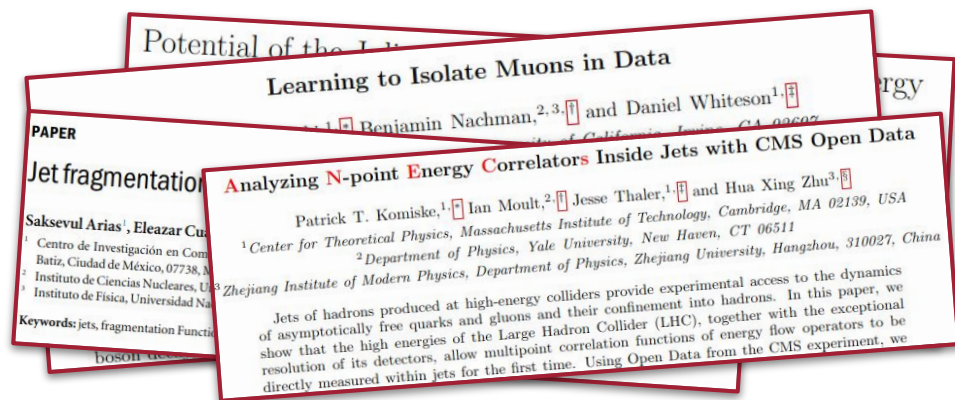


### Available at a computer near you!

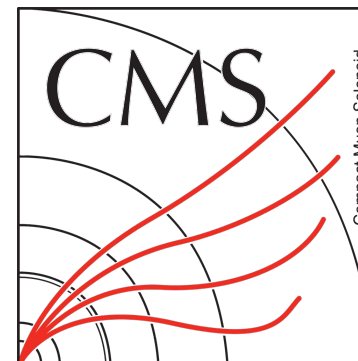
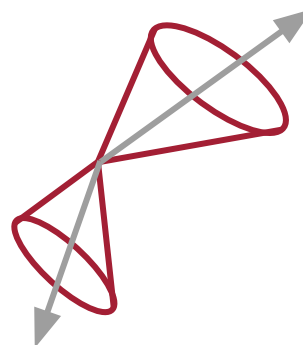
Photo by [Kelly Sikkema](#) on [Unsplash](#)

# This Talk

**CMS Open Data,**  
who uses it, and how  
it's being used

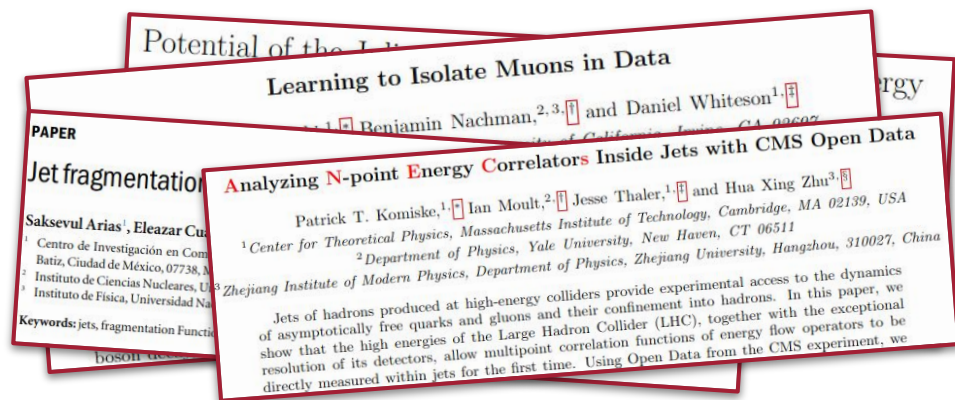


My own experiences  
and anecdotes with  
**CMS Open Data**

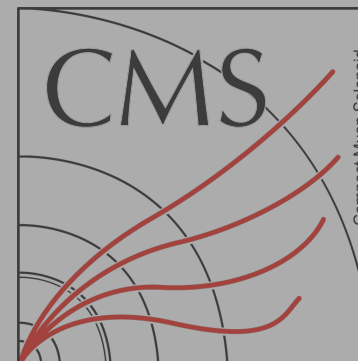
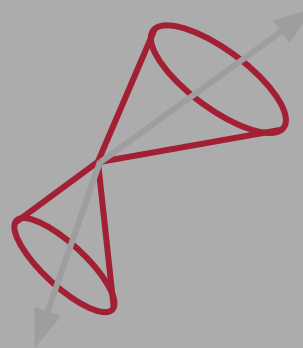


# This Talk

**CMS Open Data,**  
who uses it, and how  
it's being used

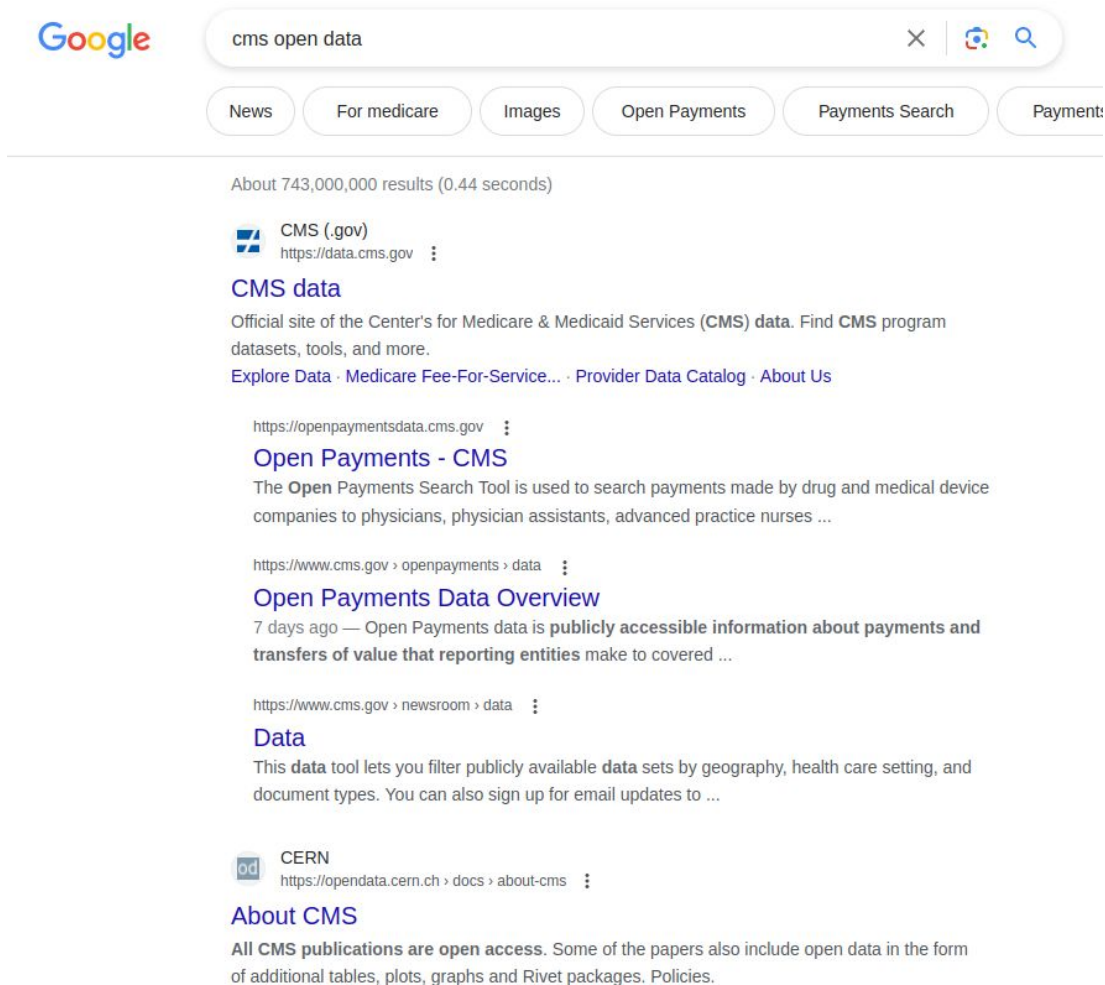


My own experiences  
and anecdotes with  
**CMS Open Data**





# CMS Open Data



Google search results for "cms open data". The search bar shows "cms open data" with a clear button and a search button. Below the search bar are tabs for News, For medicare, Images, Open Payments, Payments Search, and Payment. The results show "About 743,000,000 results (0.44 seconds)".

**CMS (.gov)**  
<https://data.cms.gov>

**CMS data**  
Official site of the Center's for Medicare & Medicaid Services (CMS) data. Find CMS program datasets, tools, and more.  
[Explore Data](#) · [Medicare Fee-For-Service...](#) · [Provider Data Catalog](#) · [About Us](#)

<https://openpaymentsdata.cms.gov>

**Open Payments - CMS**  
The **Open Payments Search Tool** is used to search payments made by drug and medical device companies to physicians, physician assistants, advanced practice nurses ...

<https://www.cms.gov/openpayments/data>

**Open Payments Data Overview**  
7 days ago — Open Payments data is **publicly accessible information about payments and transfers of value that reporting entities make to covered ...**

<https://www.cms.gov/newsroom/data>

**Data**  
This **data** tool lets you filter publicly available **data** sets by geography, health care setting, and document types. You can also sign up for email updates to ...

**CERN**  
<https://opendata.cern.ch/docs/about-cms>

**About CMS**  
All **CMS publications are open access**. Some of the papers also include open data in the form of additional tables, plots, graphs and Rivet packages. Policies.

According to Google...

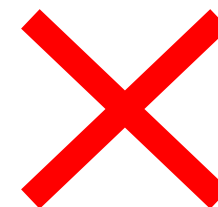
# CMS Open Data

Google search results for "cms open data".

Search results:

- Not this!**  
CMS (.gov)  
<https://data.cms.gov>  
**CMS data**  
Official site of the Center's for Medicare & Medicaid Services (CMS) data. Find CMS program datasets, tools, and more.  
Explore Data · Medicare Fee-For-Service... · Provider Data Catalog · About Us  
<https://openpaymentsdata.cms.gov>  
**Open Payments - CMS**  
The Open Payments Search Tool is used to search payments made by drug and medical device companies to physicians, physician assistants, advanced practice nurses ...  
<https://www.cms.gov/openpayments/data>  
**Open Payments Data Overview**  
7 days ago — Open Payments data is publicly accessible information about payments and transfers of value that reporting entities make to covered ...  
<https://www.cms.gov/newsroom/data>  
**Data**  
This data tool lets you filter publicly available data sets by geography, health care setting, and document types. You can also sign up for email updates to ...
- This!**  
CERN  
<https://opendata.cern.ch/docs/about-cms>  
**About CMS**  
All CMS publications are open access. Some of the papers also include open data in the form of additional tables, plots, graphs and Rivet packages. Policies.

According to Google...



# CMS Open Data

<http://opendata.cern.ch/>

The screenshot shows the CMS Open Data website. At the top is a dark blue header with the 'opendata CERN' logo on the left and 'Help' and 'About' links on the right. Below the header, a large text area says 'Explore more than **three petabytes** of open data from particle physics!'. Underneath this is a search bar with the placeholder text 'Start typing...' and a blue 'Search' button. Below the search bar, there are 'search examples: [collision datasets](#), [keywords:education](#), [energy:7TeV](#)'. The page is divided into two main sections: 'Explore' on the left and 'Focus on' on the right. The 'Explore' section lists links for 'datasets', 'software', 'environments', and 'documentation'. The 'Focus on' section lists links for 'ATLAS', 'ALICE', 'CMS' (which is highlighted with a red border), 'LHCb', and 'OPERA'. The background of the page features a faint, stylized image of particle tracks.

opendata  
CERN

Help About ▾

Explore more than **three petabytes** of open data from particle physics!

Start typing... Search

search examples: [collision datasets](#), [keywords:education](#), [energy:7TeV](#)

**Explore**

- [datasets](#)
- [software](#)
- [environments](#)
- [documentation](#)

**Focus on**

- [ATLAS](#)
- [ALICE](#)
- [CMS](#)**
- [LHCb](#)
- [OPERA](#)



# In 2020...

## In Backup

*“Researching physics in and beyond the Standard Model”*

19  
All ~~13~~ papers (thus far) using CMS Open Data



Standard Model Analyses

[Tripathy, Xue, Larkoski, Marzani, JDT, [PRL 2017](#), [PRD 2017](#)]  
[Apyan, CuoZZo, Klute, Saito, Schott, Sintayehu, [JINST 2020](#)]

BSM Searches

[Cesarotti, Soreq, Strassler, JDT, Xue, [PRD 2019](#)]  
[Lester, Schott, [JHEP 2019](#)]

Machine Learning Studies

[Fernández Madrazo, Heredia Cacha, Lloret Iglesias, Marco de Lucas, [EPJWC 2019](#)]  
[Andrews, Paulini, Gleyzer, Poczos, [CSBS 2020](#)]  
[Andrews, Alison, An, Bryant, Burkle, Gleyzer, Narain, Paulini, Poczos, Usai, [NIM 2020](#)]  
[Moreno, Nguyen, Vlimant, Cerri, Newman, Periwai, Spiropulu, Duarte, Pierini, [PRD 2020](#)]  
[Knapp, Dissertori, Cerri, Nguyen, Vlimant, Pierini, [arXiv 2020](#)]

And More!

[Pata, Spiropulu, [arXiv 2019](#)]  
[Paktinat Mehdiabadi, Fahim, [JPG 2019](#)]  
[Komiske, Mastandrea, Metodiev, Naik, JDT, [PRD 2020](#)]

Please contact me if I missed your CMS Open Data study!

Jesse Thaler (MIT) — The Future is Open: Adventures with Public Collider Data

13

[Thaler, [Adventures with Public Collider Data \(2020\)](#)]

In 2023...

In Backup

74 (At Least!)

ing physics in and  
Standard Model”

All 13 papers (thus far) using CMS Open Data

literature ▾

references.reference.doi:10.7483/OPENDATA.CMS\*



Standard Model Analyses

[Tripathi, Xue, Larkoski, Marzani, JDT, [PRL 2017](#), [PRD 2017](#)]  
[Apyan, Cuozzo, Klute, Saito, Schott, Sintayehu, [JINST 2020](#)]

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[Cesarotti, Soreq, Strassler, JDT, Xue, [PRD 2019](#)]  
[Lester, Schott, [JHEP 2019](#)]

Machine Learning Studies

[Fernández Madrazo, Heredia Cacha, Lloret Iglesias, Marco de Lucas, [EPJWC 2019](#)]  
[Andrews, Paulini, Gleyzer, Poczos, [CSBS 2020](#)]  
[Andrews, Alison, An, Bryant, Burkle, Gleyzer, Narain, Paulini, Poczos, Usai, [NIM 2020](#)]  
[Moreno, Nguyen, Vlimant, Cerri, Newman, Periwai, Spiropulu, Duarte, Pierini, [PRD 2020](#)]  
[Knapp, Dissertori, Cerri, Nguyen, Vlimant, Pierini, [arXiv 2020](#)]

And More!

[Pata, Spiropulu, [arXiv 2019](#)]  
[Paktinat Mehdiabadi, Fahim, [JPG 2019](#)]  
[Komiske, Mastandrea, Metodiev, Naik, JDT, [PRD 2020](#)]

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Jesse Thaler (MIT) — The Future is Open: Adventures with Public Collider Data

13

[Thaler, [Adventures with Public Collider Data \(2020\)](#)]

In 2023...

In Backup

~~19~~

**74 (At Least!)**

"Researching physics in and beyond the Standard Model"

All ~~13~~ papers (thus far) using CMS Open Data

Just a (very) **small** selection of recent studies!

## QCD

[Lee, Meçaj, Moul, [2205.03414](#)]  
[Komiske, Moul, Thaler, Zhu, [2205.04459](#)]  
[Komiske, Kryhin, Thaler, [2201.07800](#)]

## BSM

[Mahmoud, Elgammal, Abdallah, Hussein, [2304.09483](#)]  
[Mandrik, [2205.06134](#)]  
[Cesarotti, Soreq, Strassler, Thaler, Xue, [1902.04222](#)]

## ML/AI

[Schuhmacher et. al., [2301.10787](#)]  
[Chen et. al., [2108.02214](#)]  
[Moreno et. al., [1909.12285](#)]

## Framework Development

[Eschle et. al., [2306.03675](#)]  
[Osborne, Pivarski, [2302.0986](#)]  
[Padulano et. al., [CDS-2856552](#)]

## ... And More!

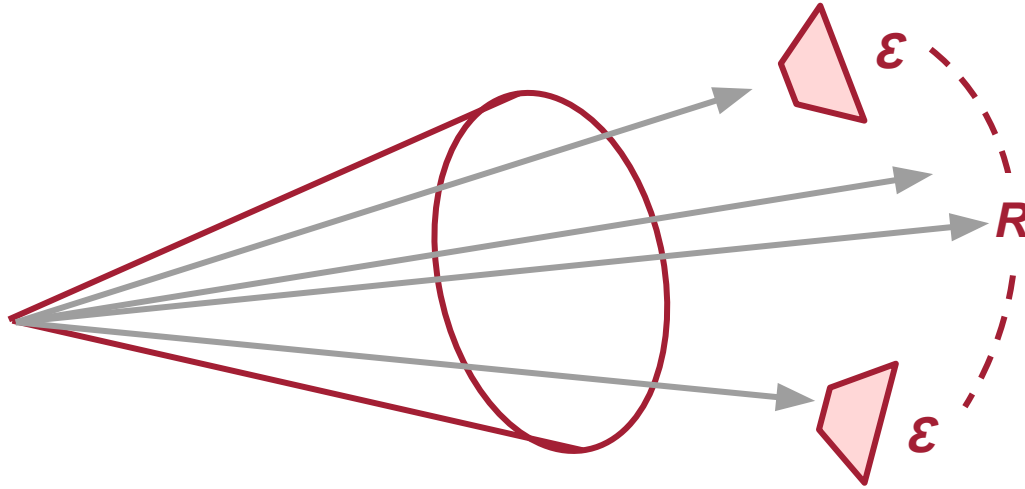
[Fischer et. al., [2109.06065](#)]  
[Apyan et. al., [1907.08197](#)]  
[Cowton et. al., [CDS-2134548](#)]

[Thaler, [Adventures with Public Collider Data \(2020\)](#)]

# Some Fun Recent Highlights

\*With a strong bias towards research done by members of my group/home institution

# Example 1: Energy-Energy Correlators

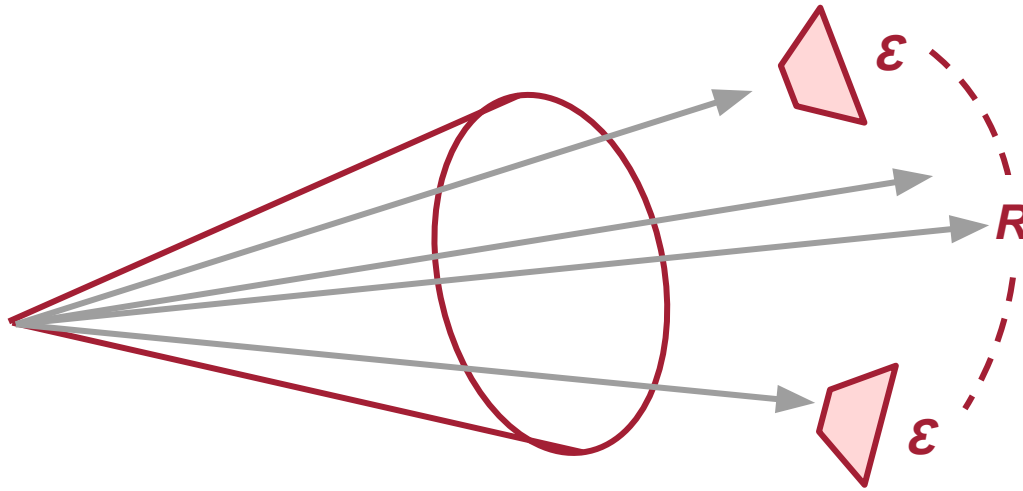


**Energy-Energy Correlators** ( $EECs$  (and  $E^N Cs$ )) let us explore different aspects of QCD, including scaling behavior, collinear structure, phase transitions, and more

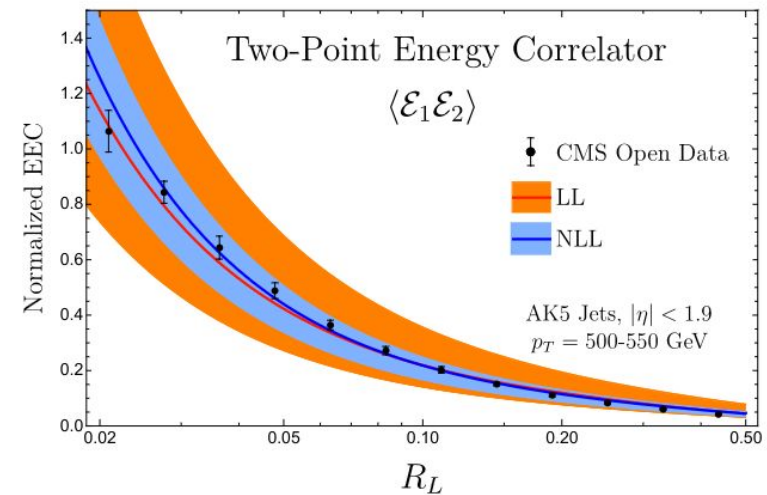
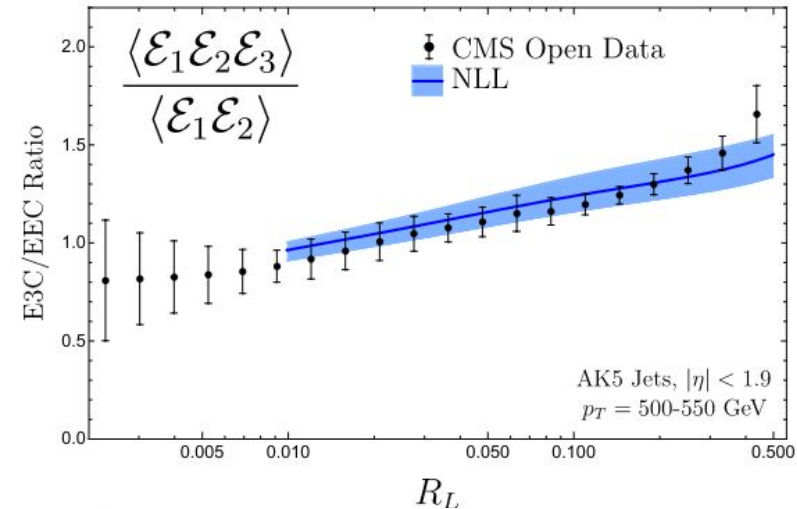
Explored in CMS Open Data!

$$\text{ENC}(R_L) = \left( \prod_{k=1}^N \int d\Omega_{\vec{n}_k} \right) \delta(R_L - \Delta \hat{R}_L) \cdot \frac{1}{(E_{\text{jet}})^N} \langle \mathcal{E}(\vec{n}_1) \mathcal{E}(\vec{n}_2) \dots \mathcal{E}(\vec{n}_N) \rangle$$

# Example 1: Energy-Energy Correlators

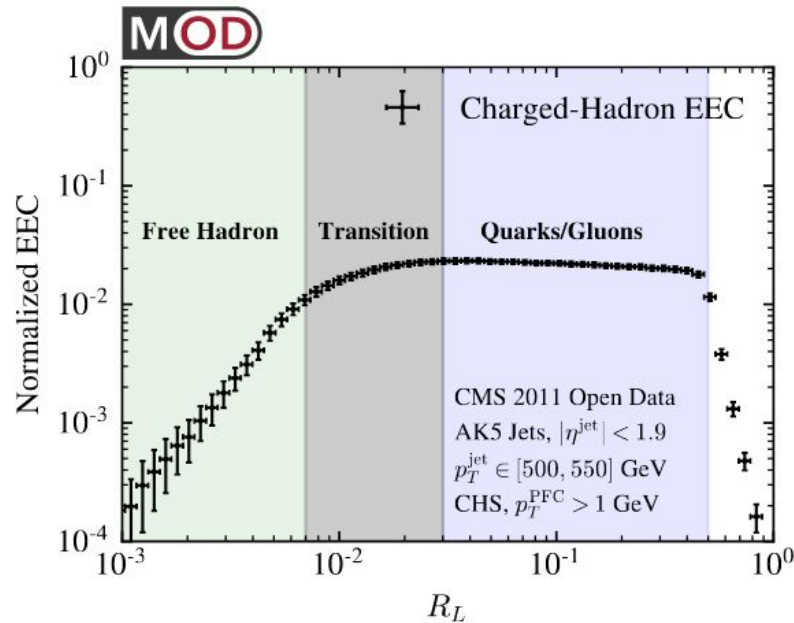


Possible for phenomenologists to compare calculations to data *directly*!



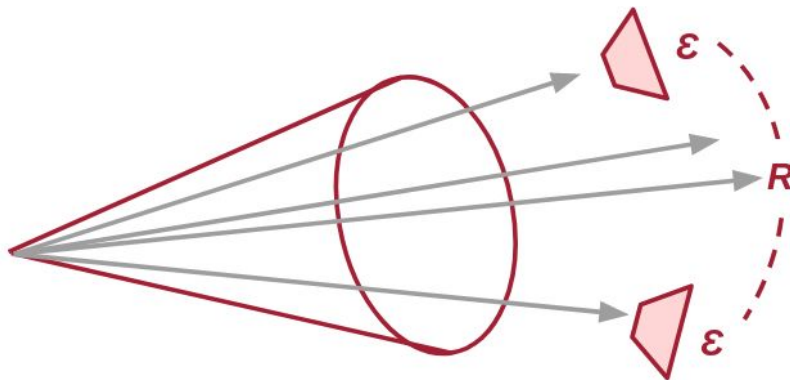


# Example 1: Energy-Energy Correlators

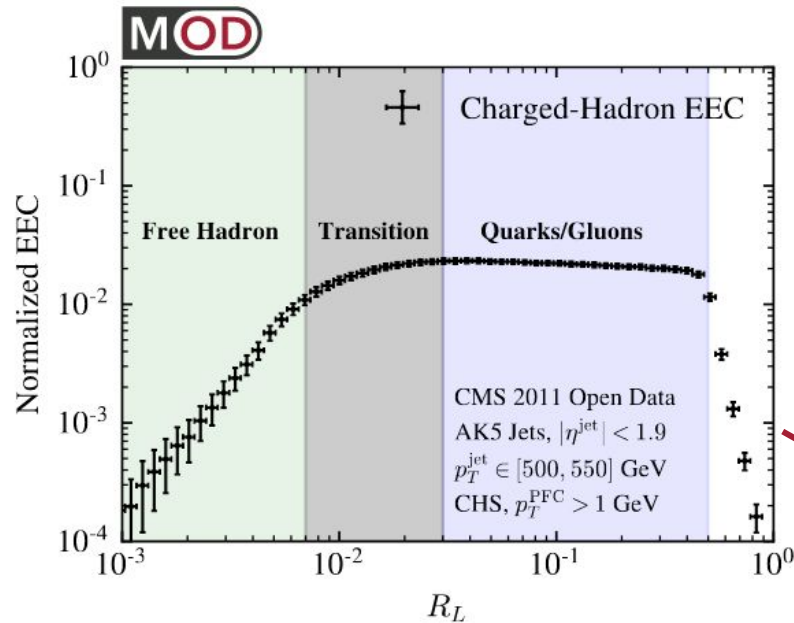


Different length scales probe different regimes of QCD!

Can see it all within Open Data!

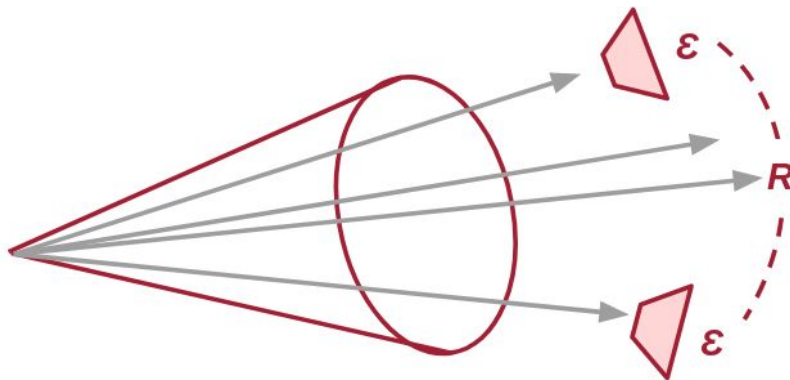


# Example 1: Energy-Energy Correlators



Different length scales probe different regimes of QCD!

Can see it all within Open Data!

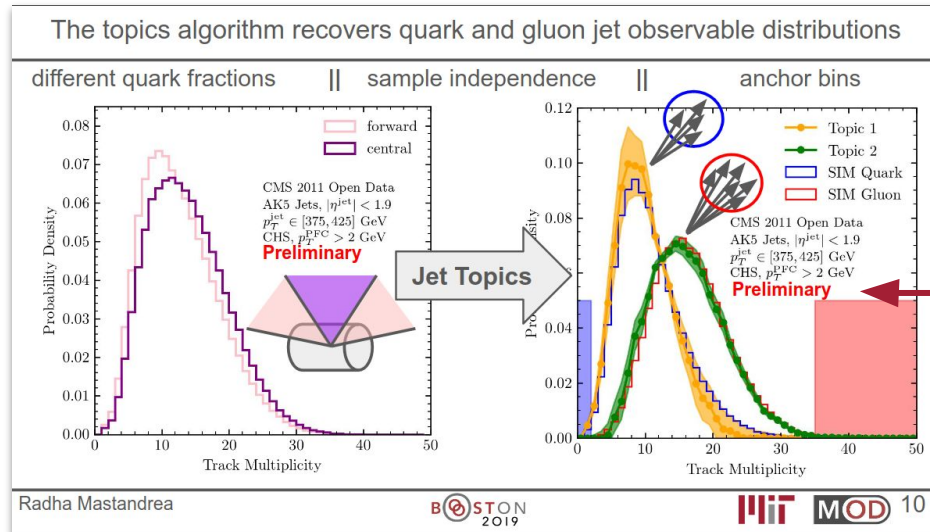


A similar measurement is now being done by CMS for Run II Data (see [APS April talk](#)).

Open Data analyses can inspire measurements!

## Example 2: Jet Topics

Slight difference  
in detector  
response for  
forward vs.  
central **quark** vs.  
**gluon** jets



[Mastandrea, [Analyzing CMS Open Collider Data through Topic Modeling \(2019\)](#)]

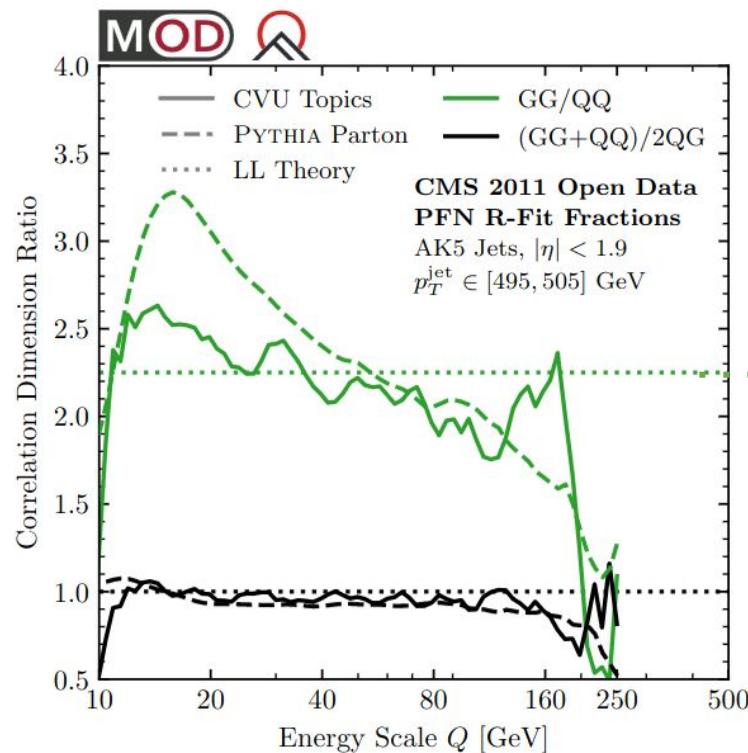
A jet  $x$  is never purely a **quark** jet or a **gluon** jet, but rather a mixture:

$$p_{\text{mixed}}(\vec{x}) = f_q p_{\text{quark}}(\vec{x}) + (1 - f_q) p_{\text{gluon}}(\vec{x})$$

Can be used to *operationally*  
define quark/gluon categories,  
slightly different from Pythia  
labels, using **Topic Modeling**!

## Example 2: Jet Topics

Can turn these quark/gluon distributions into measurements of **fundamental constants** of QCD in CMS Open Data!

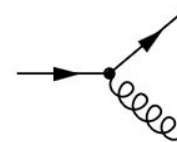


$$dP_{i \rightarrow jk} = \frac{2\alpha_s}{\pi} C_i \frac{d\theta}{\theta} \frac{dE}{E}$$

$$\frac{9}{4} = \frac{C_A}{C_F}$$

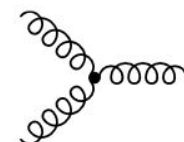


Quarks



$$C_F = \frac{4}{3}$$

Gluons

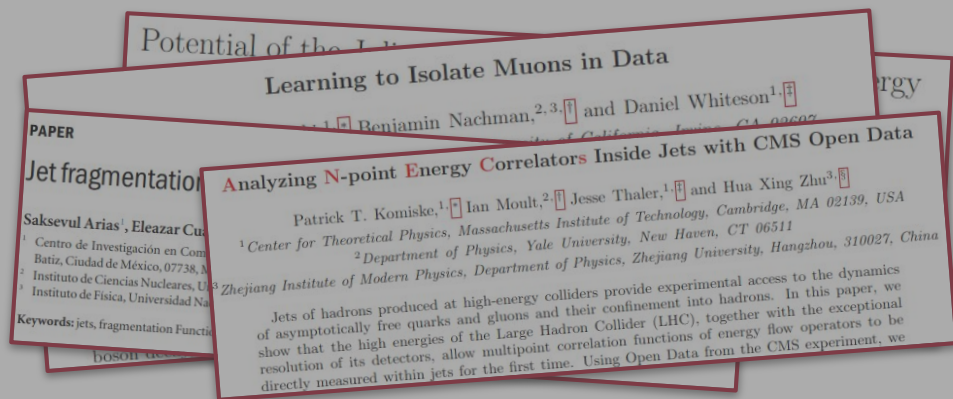


$$C_A = 3$$

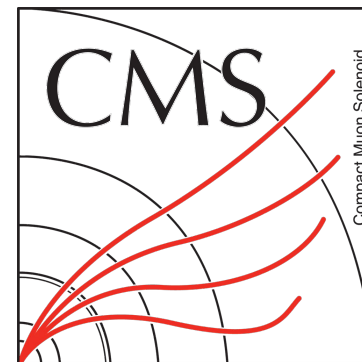
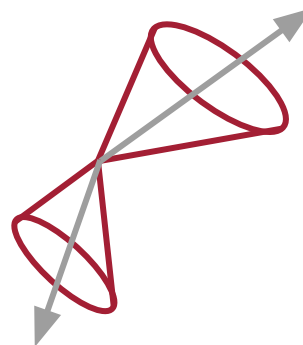
Correlation dimensions are defined using Wasserstein geometry, ask me about it later!

# This Talk

**CMS Open Data,**  
who uses it, and how  
it's being used



My own experiences  
and anecdotes with  
**CMS Open Data**



# Open Data as a teaching tool

## Higgs-to-four-lepton analysis example using 2011-2012 data

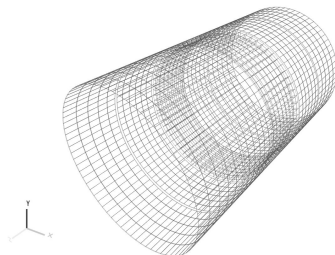
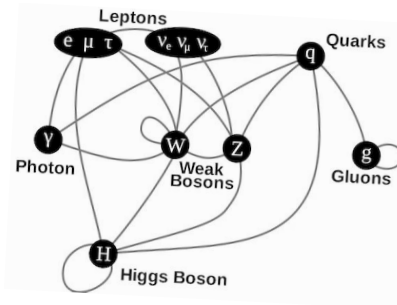
 Jomhari, Nur Zulaiha ;  Geiser, Achim ;  Bin Anuar, Afiq Aizuddin

Cite as: Jomhari, Nur Zulaiha; Geiser, Achim; Bin Anuar, Afiq Aizuddin; (2017). Higgs-to-four-lepton analysis example using 2011-2012 data. CERN Open Data Portal. DOI:[10.7483/OPENDATA.CMS.JKB8.RR42](https://doi.org/10.7483/OPENDATA.CMS.JKB8.RR42)

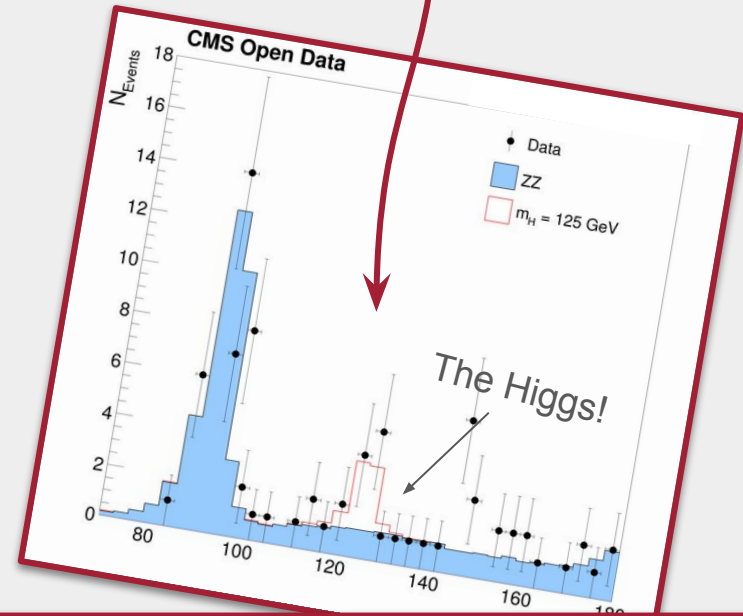
[Software](#) [Analysis](#) [Workflow](#) [CMS](#) [CERN-LHC](#)

# ROOT

An Object-Oriented  
Data Analysis Framework



Me as an undergrad in 2018 joining the Rutgers CMS B2G Group



One of my ever first plots!



# My favorite dataset: CMS2011AJets

Jet Data collected in 2011 Run A

Applied *HLT Jet300* single-jet trigger

AK5 Jets with  $p_T > 375$  GeV

AOD files located at Record 21, with associated MC (in both SIM/GEN varieties) at Records 1364 - 1369

Perfect for QCD & Jet studies!

<http://opendata.cern.ch/record/21>

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

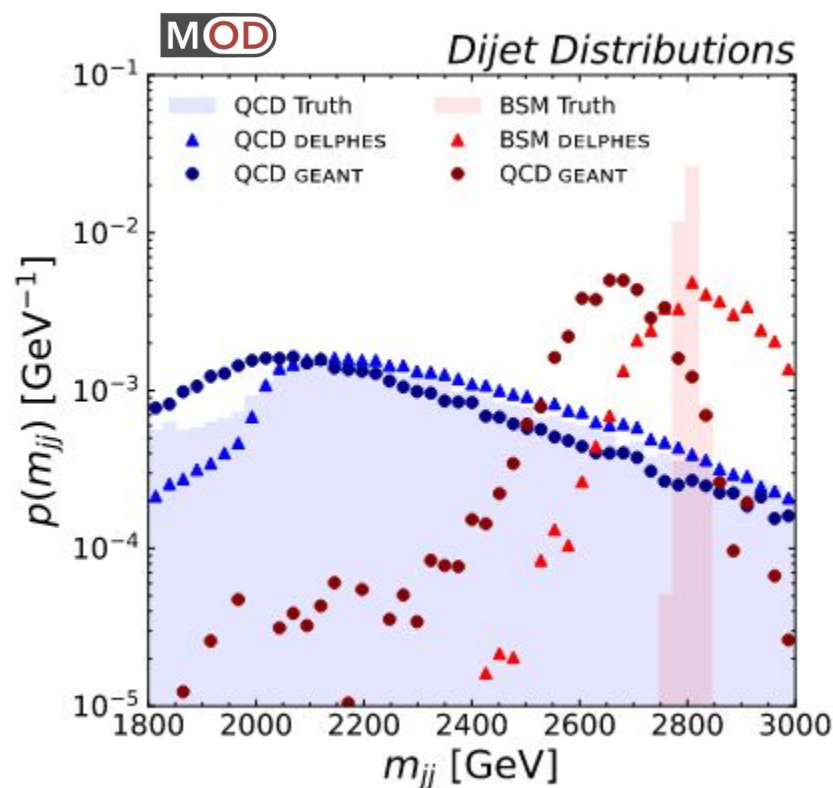
/Jet/Run2011A-12Oct2013-v1/AOD, CMS collaboration

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

DOI:10.7483/OPENDATA.CMS.UP77.P6PQ

Dataset Collision CMS 7TeV CERN-LHC

opendata  
CERN



Pictured: Dijet mass of QCD samples from CMS Open Sim at truth and detector level, [RG, Nachman, Thaler, [2205.05084](https://arxiv.org/abs/2205.05084)]

# My favorite way to access open data: The **MIT Open Data (MOD)** Format

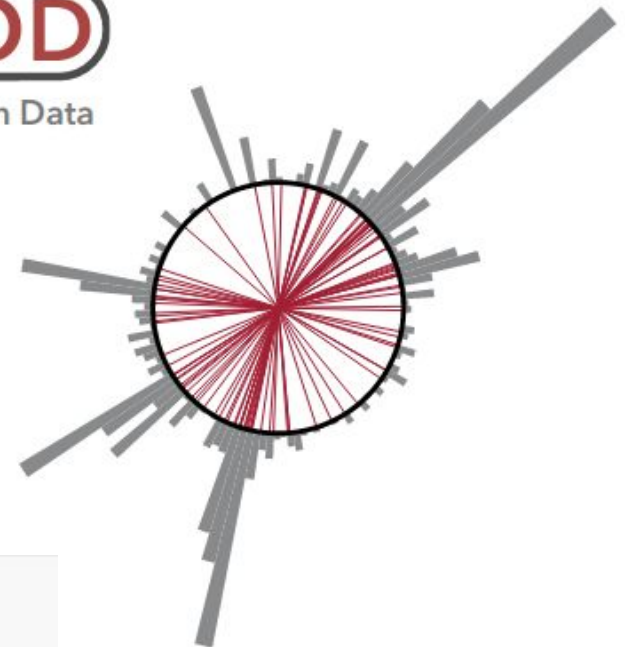
Processed AOD files into manageable  
“MOD HDF5” text files hosted at  
<https://zenodo.org/record/3340205>

Very **easy to access** – no CMSSW, no  
virtual machines, no ROOT, no  
complicated AODs ...

Can easily download *anywhere* on *any*  
*machine* with *energyflow*:

```
import energyflow as ef

# Load data
specs = [f'{500} <= corr_jet_pts <= {1000}', f'abs_jet_eta < {1.9}', f'quality >= {2}']
sim = ef.mod.load(*specs, dataset='cms')
```



Try *pip install energyflow*

# My favorite way to access open data: The MIT Open Data (MOD) Format

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sim = ef.mod.load(*specs, dataset='cms')
```

**This** is the reason why  
CMS2011AJets is my favorite  
dataset – it's the easiest one  
to access!

Easy Data → Easy  
Analysis!

Try `pip install energyflow`

# My typical workflow:

## Step 1: Download CMS Open Data!

```
# Parameters
R = 0.5
beta = 1.0
N = 50
pt_lower = 475
pt_upper = 525
eta = 1.9
quality = 2
pad = 125
plot_dir = "results"

# Load data (NOTE: Need the `energyflow` package installed for the default dataset, or provide your own data)
dataset, _ = load_cmsopendata("~/energyflow/", "cms", pt_lower, pt_upper, eta, quality, pad, n = N)

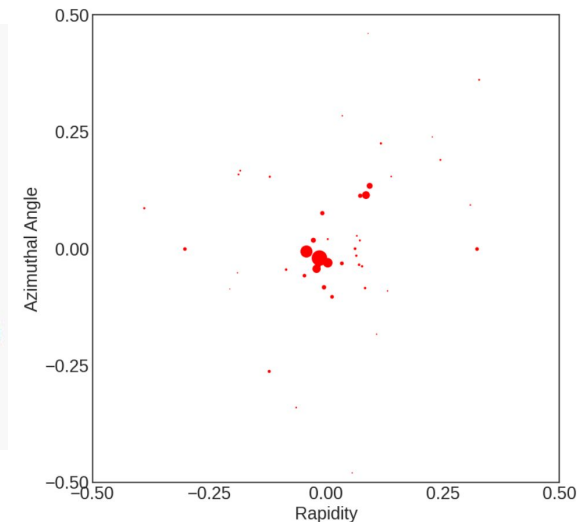
example_event = dataset[0]
plot_event(example_event[0], example_event[1], R, color = "red")
```

Downloads the **CMS2011AJets** dataset using MOD, does minor preprocessing, and converts to *np* arrays

On a fresh machine, takes only 5 minutes to download a 100,000 jet sample

Ease of download makes open data great as an example data set (especially for **tutorials**)! I don't have to worry about Pythia, Geant, etc ...

Pictured: An AK5 Jet measured during Run A in 2011



# My typical workflow:

## Step 2: Set up calculations, e.g.

```
# Sample from a normalized uniform distribution
def uniform_sampler(N, param_dict):
    points = torch.FloatTensor(N, 2).uniform_(-R, R).to(device)
    zs = torch.ones((N,)).to(device) / N
    return (points, zs)

_isotropy = Observable({}, uniform_sampler, beta = beta, R = R)

#####
##### N-Point-Ellipsiness #####
#####

# Sample points from N uniform ellipses plus weighted points at their center
def point_ellipse_sampler(N, param_dict):
    centers = param_dict["Points"].params
    num = param_dict["Points"].N
    radii1 = param_dict["Radius1"].params
    radii2 = param_dict["Radius2"].params
    angles = param_dict["Angles"].params
    weights = param_dict["Weights"].params

    phi = 2 * np.pi * torch.rand(num, N).to(device)
    r = torch.sqrt(torch.rand(num, N)).to(device)
    points = torch.stack([radii1[:, None] * torch.cos(phi + angles[:, None]), radii2[:, None] * torch.sin(phi + angles[:, None])])
    points = torch.cat([point for point in points], dim=1)

    # Concatenate and reweight
    e = torch.cat([centers, points.T], dim=0)
    z1 = torch.cat([weights[i] * torch.ones((1,)), device=device) for i in range(num)], dim=0)
    z2 = torch.cat([weights[num + i] * torch.ones((N,)), device=device) / N for i in range(num)], dim=0)
    z = torch.cat([z1, z2], dim=0)
    return (e, z)

_3pointellipsiness = Observable({"Points": Coordinates2D(3), "Weights": Simplex(2*3), "Radius1": PositiveReals(3, 0), "Radius2":
```

For me, this usually involves defining QCD observables or building ML tools to act on the data – This is where all the physics happens!

# My typical **workflow**:

**Step 3:** Run all calculations on the data!

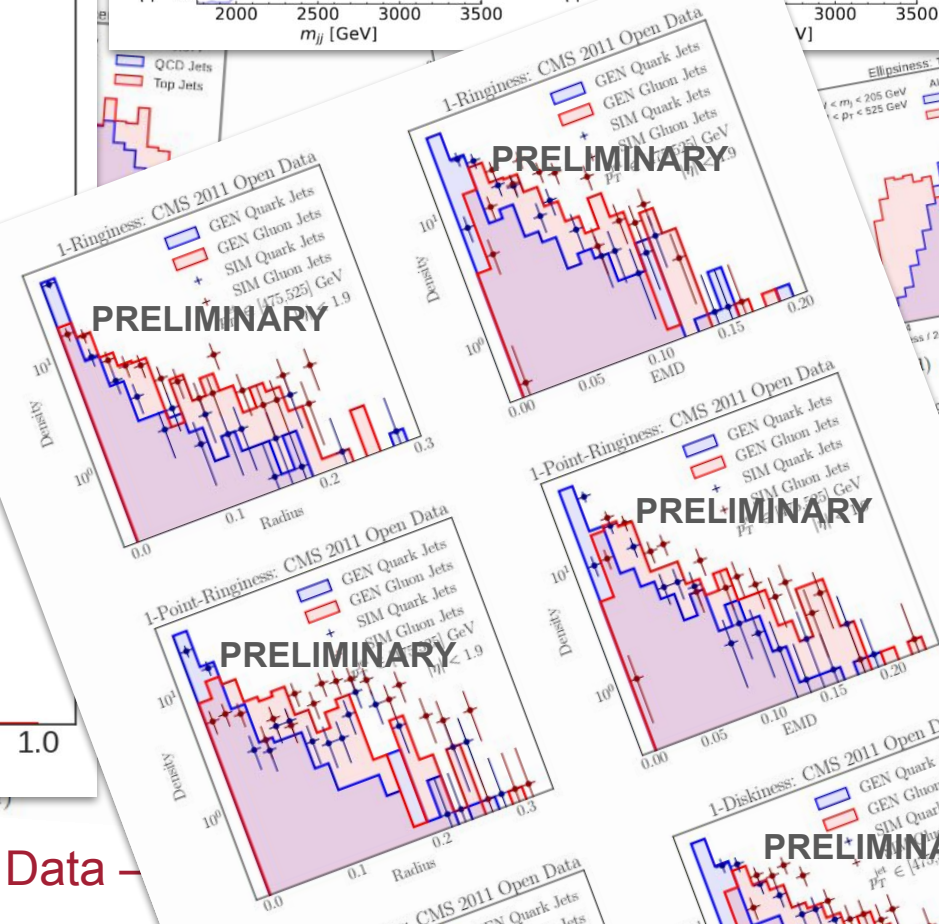
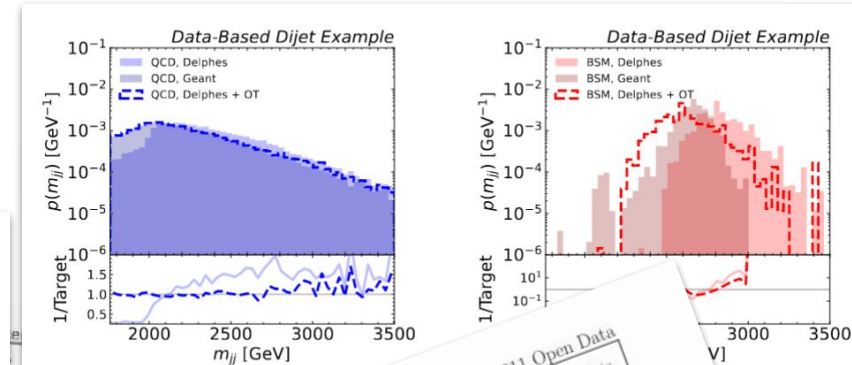
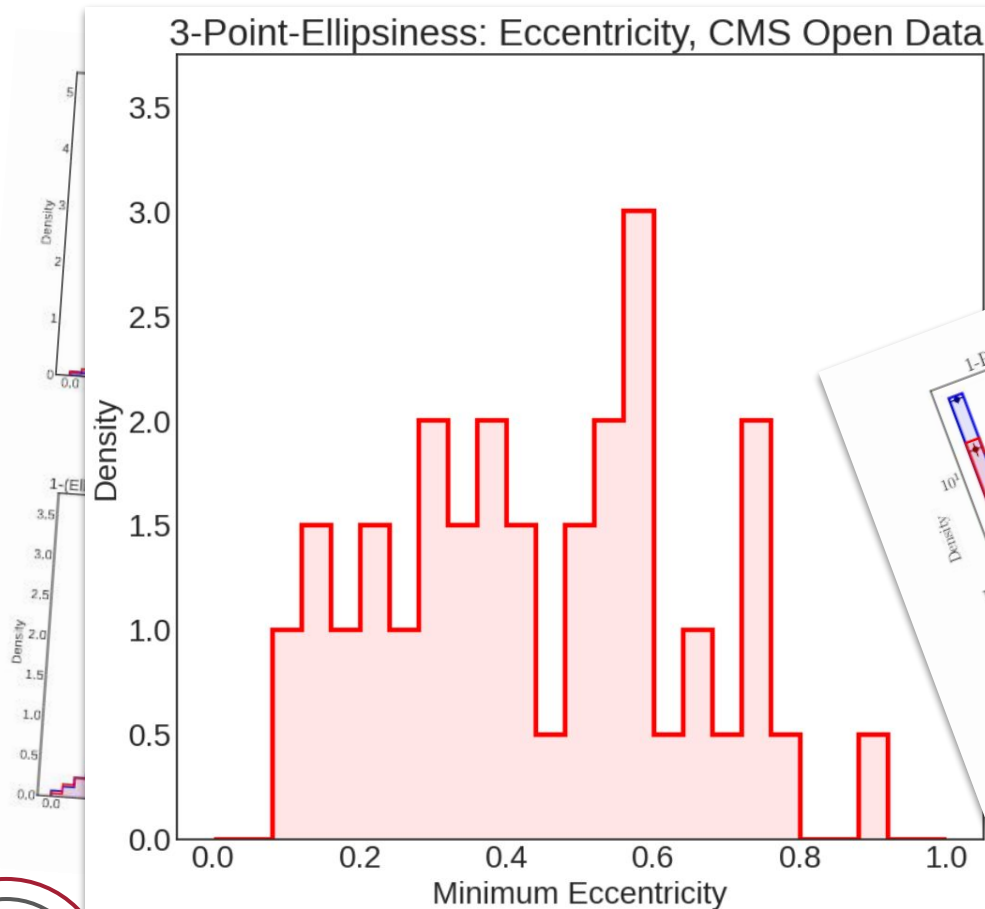
```
plot_dictionary = {  
    "plot_directory" : "Plots/Test",  
    "gif_directory" : "Plots/Test/gifs",  
    "extension" : "png",  
    "title" : "CMS Jets"  
}  
  
# Initialize SHAPER  
shaper = Shaper(observables, device)  
shaper.to(device)  
  
emds, params = shaper.calculate(dataset, epochs = 500, verbose=True, lr = 0.01, N = 100, scaling = 0.9, epsilon = 0.001)
```

(Often done on a big cluster rather than a Jupyter notebook ...)



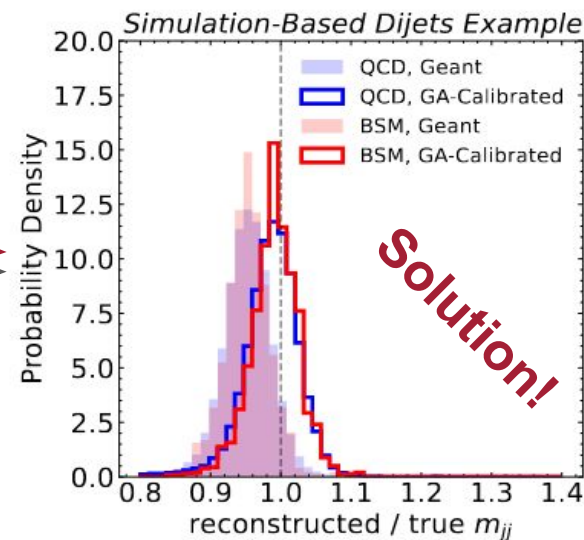
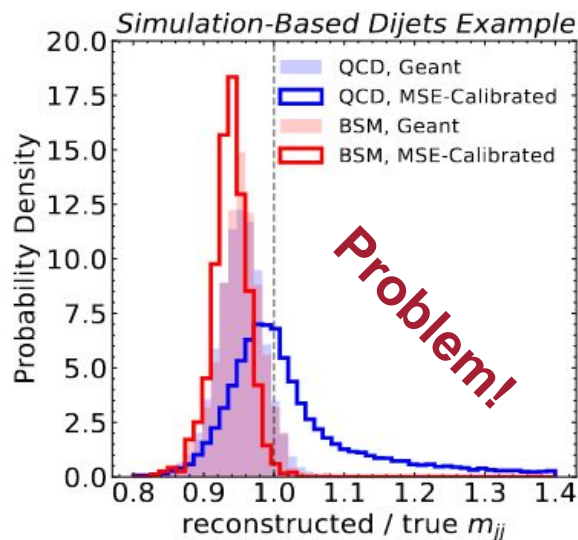
# My typical workflow:

## Step 4: Plots Plots Plots Plots Plots!



# CMS Open Sim for Calibration

$$\begin{aligned}
 T(x, z) &= A(x) \\
 &+ (z - B(x)) \cdot D(x) \\
 &+ \frac{1}{2} (z - B(x))^T \cdot C(x, z) \cdot (z - B(x)) \\
 \mathcal{L}_{\text{DVR}}[T] &= -\left( \mathbb{E}_{P_{XZ}}[T] - \log(\mathbb{E}_{P_X \otimes P_Z}[e^T]) \right) \\
 &+ \lambda_D \mathbb{E}_{P_{XZ}}|D(X)|
 \end{aligned}$$

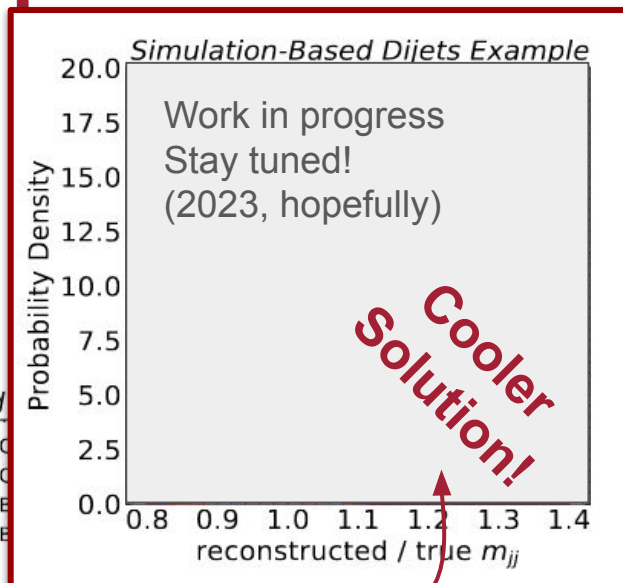
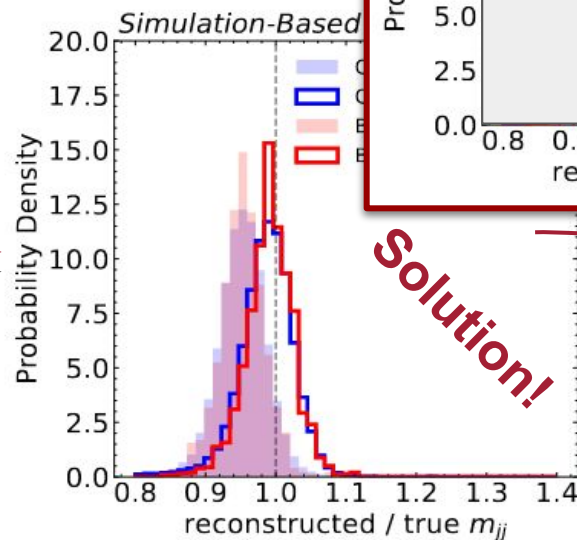
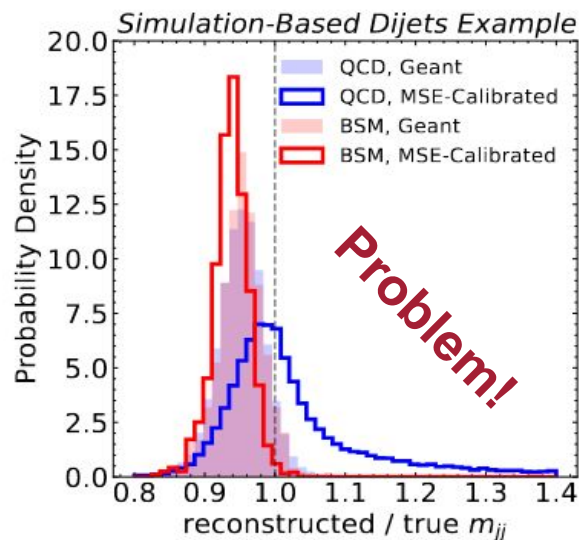


... Using Open Data as an easy, realistic example dataset for **ML studies** and **calibration**!



# CMS Open Sim for Calibration

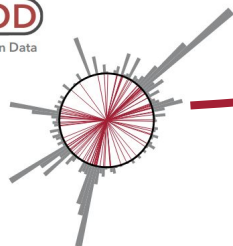
$$\begin{aligned}
 T(x, z) &= A(x) \\
 &+ (z - B(x)) \cdot D(x) \\
 &+ \frac{1}{2} (z - B(x))^T \cdot C(x, z) \cdot (z - B(x)) \\
 \mathcal{L}_{\text{DVR}}[T] &= -\left( \mathbb{E}_{P_{XZ}}[T] - \log(\mathbb{E}_{P_X \otimes P_Z}[e^T]) \right) \\
 &+ \lambda_D \mathbb{E}_{P_{XZ}}|D(X)|
 \end{aligned}$$



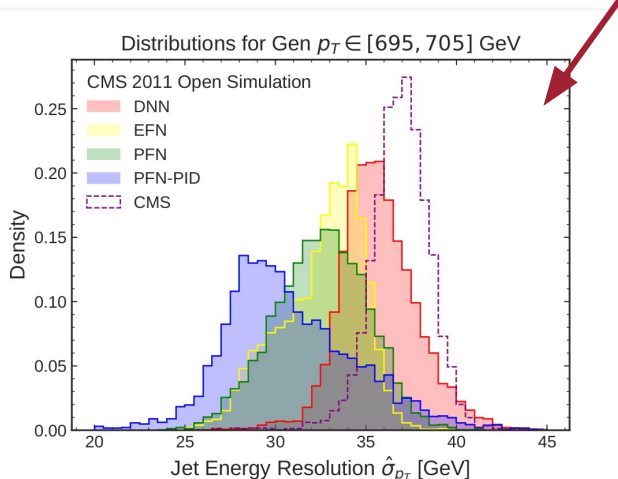
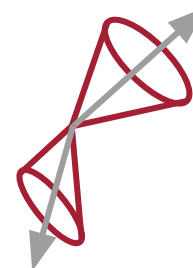
... Using Open Data as an easy, realistic example dataset for **ML studies** and **calibration**!



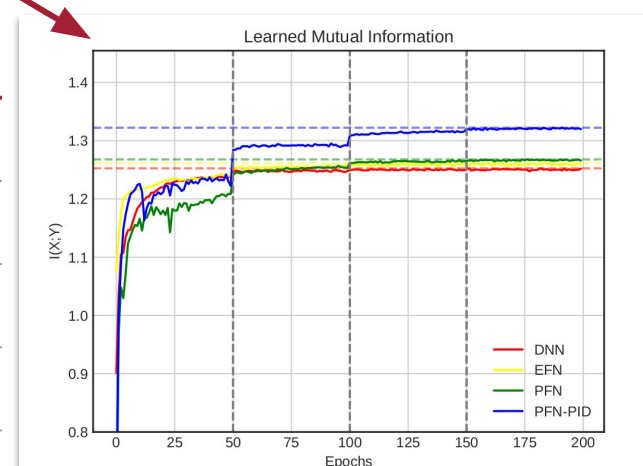
# CMS Open Sim for **Uncertainty Estimation**



Gaussian Ansatz



Model	Avg Resolution [GeV]	Mutual Information $I(X;Z)$
<b>DNN</b>	$35.7 \pm 2.1$	1.23
<b>EFN</b>	$32.6 \pm 2.3$	1.26
<b>PFN</b>	$32.5 \pm 2.5$	1.27
<b>PFN-PID</b>	<b><math>30.8 \pm 3.6</math></b>	<b>1.32</b>
<b>CMS Open Data</b>	$36.9 \pm 1.7$	—

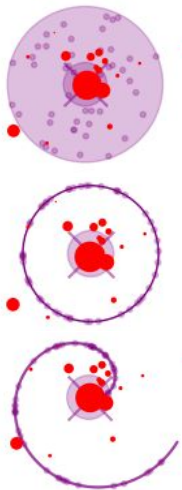
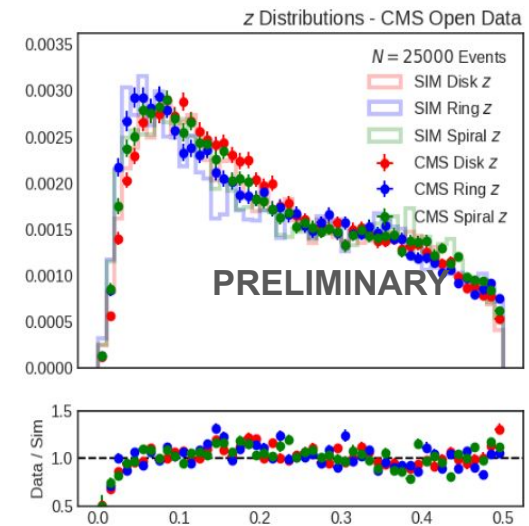
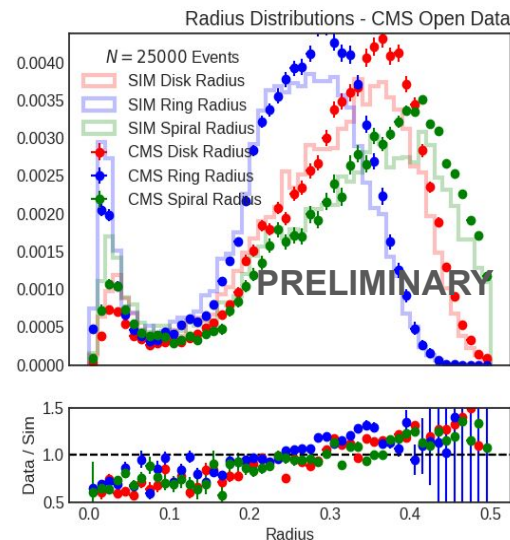
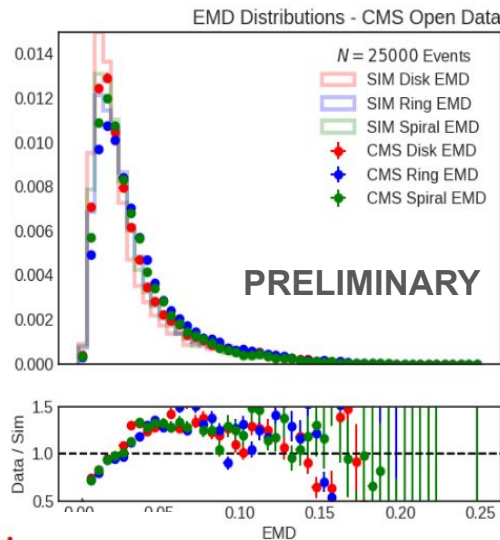


... Using Open Data to understand **detector efforts** and quantify **uncertainties and correlations** with **ML**!





# Hearing the Shapes of Jets



**Disk** +  
 $\delta$ -function

**Ring** +  $\delta$ -function

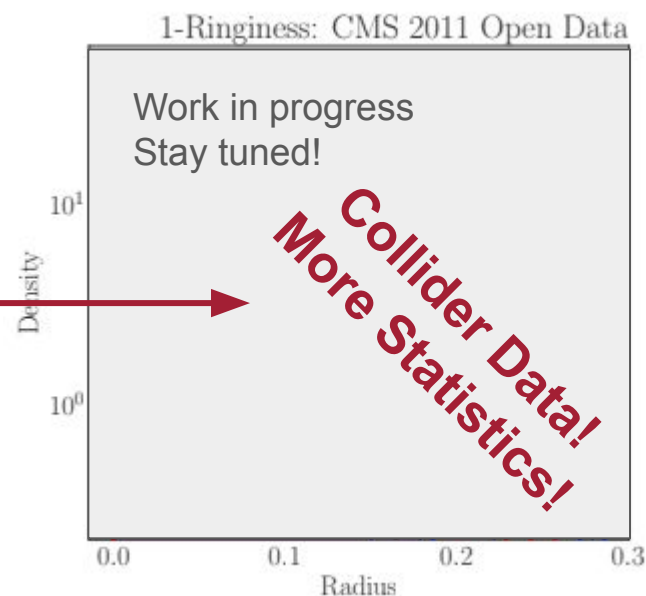
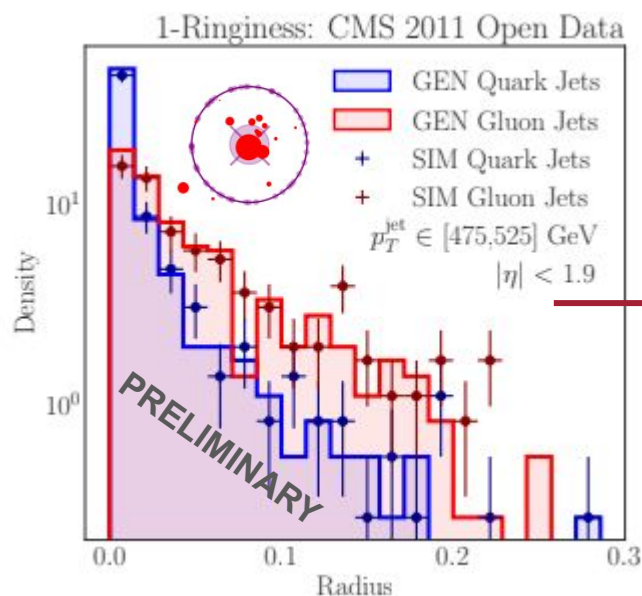
**Spiral** +  $\delta$ -function

Probing **collinear** ( $\delta$ -function) and **soft** (shape) structure!

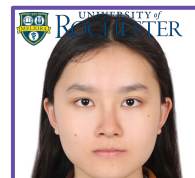
Are some aspects of substructure not well modeled in Pythia? Check against data!



# How **wide** are QCD jets?

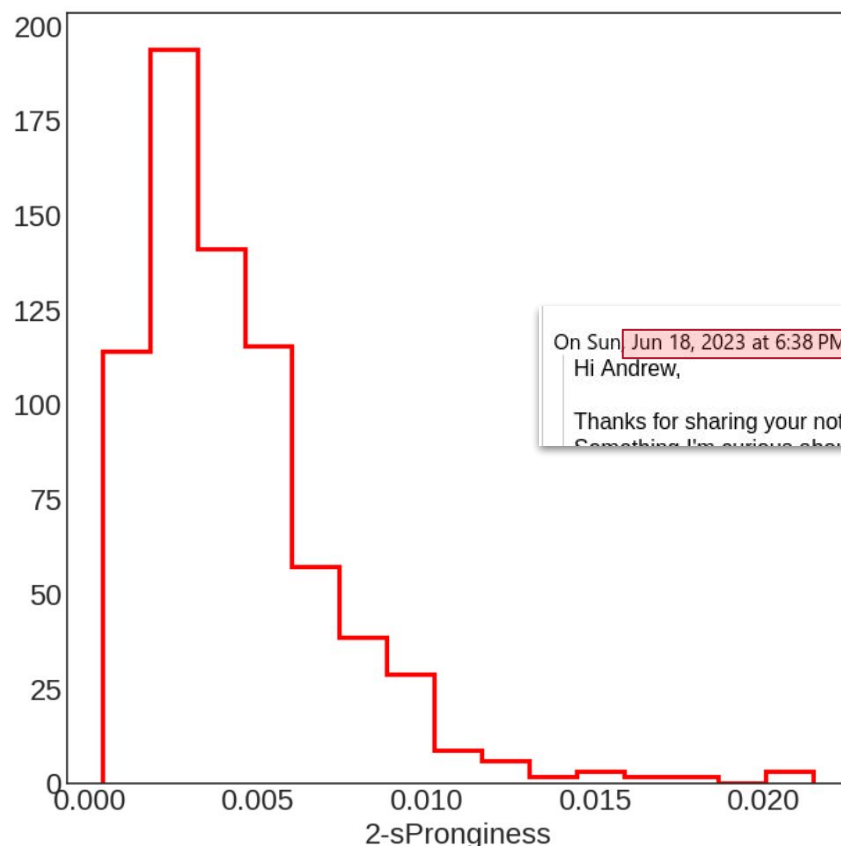


Determining the radius distribution of q/g jets in data with an **MIT Summer Research Program undergrad** (Xinyue Wu)! From zero to this in a few weeks!





# Prototyping new metrics



Easy to use CMS2011AJets as a realistic dataset to prototype new things without having to generate my own data!

On Sun, Jun 18, 2023 at 6:38 PM Rikab Gambhir <[rikab@mit.edu](mailto:rikab@mit.edu)> wrote:  
Hi Andrew,

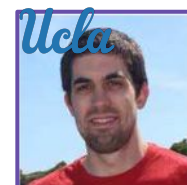
Thanks for sharing your notes, this looks every interesting! I'll take a crack at seeing if I can code up the spectral EMD. Something I'm curious about is (a) since the difficult EMD calculation is already done analytically, I wonder if it's possi

## preliminary spectral density test

main

Rikab Gambhir committed 2 weeks ago

Showing 2 changed files with 450 additions and 1 deletion Jun 20, 2023, 3:41 PM EDT



# How do I take my cup of CMS Open Data?

- Very easily accessible anywhere I am
- Takes only a few seconds to minutes to set up
- Highly preprocessed and prepackaged
- Don't have to understand all the details of how it was made
- Helps me make plots
- Can order online
- Made by somebody else
- Contains flavor information

Admittedly, the last few are a stretch

Start your day with a cup of  
**CMS open data**



**Available at a computer near you!**

Photo by [Kelly Sikkema](#) on [Unsplash](#)

# How do I take my Conclusion Open Data?

Start your day with a cup of

But it's good to have  
some variety in coffee!

How can we enable  
more datasets to be  
made easily accessible  
and useable?



Admittedly, the last few are a stretch

Photo by Kelly Siddons on Unsplash