

# Model-agnostic search for dijet resonances with the CMS detector

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#### **Overview**

- Dijet events (anti- $k_{T}$ , R = 0.8)
- Look for a narrow resonance
- Leverage substructure
- Use state-of-the-art AD methods (as of two years ago)

• Compare **5** techniques for anomaly detection

#### Methods: Variational Autoencoder



- Encodes up to 100 PF\* constituents per jet
- Trained with jets from a QCD-dominated sideband ( $\Delta \eta > 1.4$ )
- Final score: lowest reconstruction loss of the two jets
- Background sculpting controlled with quantile regression

\* Particle Flow

## Methods: Weak Supervision

Train a classifier between data and a background-like sample

- **CWoLa:** background taken from sidebands
- CATHODE: background interpolated from sidebands
- Tag N' Train: autoencoder preselection, targets events with two anomalous jets

Fewer features for CATHODE than CWoLa/TNT



signal



(S)

CWoLa: 1902.02634 / CATHODE: 2109.00546 / TNT: 2002.12376

### Methods: QUAK

- Hybrid approach, encoding a **prior** on signal-like features
- Train two normalizing flows:
  - On a mixture of signal MCs
  - On background MC

2011.03550

- The losses define a 2D QUAK space
- The signal is somewhere in that space...



# **After Tagging**

- Choose a working point
- Select events
- Look at m<sub>jj</sub> spectrum
- Fit with analytic functions



# **After Tagging**

- Choose a working point
- Select events
- Look at m<sub>jj</sub> spectrum
- Fit with analytic functions
- Find a bump (maybe)
- Derive a *p*-value



#### We use everything

Compression VAE/TNT Regression **QR for VAE** Classification CWoLa et al. **Density estimation** CATHODE/QUAK **Event** generation CATHODE Hand-crafted analytical function Final *m*<sub>ii</sub> fit

#### We use everything

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... except data ...

**Complementarity** 

Do all methods find the same events?



#### Complementarity **CMS** Simulation Preliminary (13 TeV) dq qq 0.15 0.39 0.44 0.17 VAE Do all methods find ↑ ⊱ the same events? 0.15 0.65 0.18 0.14 CWoLa Hunting X(3000) → 0.30 0.17 0.65 0.25 TNT Check correlation between scores 0.39 0.18 0.25 0.62 CATHODE 0.62 0.44 0.14 0.30 **Small correlations** QUAK CWOL2 HUNTING OUNT JAE Complementarity N. aTHODE

#### **Performance:** 2 + 2



#### **Performance:** 3 + 3

Testing performance on:  $\mathbb{P}$ W'  $\rightarrow$  B't  $\rightarrow$  qqq qqq

3 + 3



#### **Performance:** 3 + 3





- CMS joining the anomaly detection party
- Looking for dijet resonances with 5 methods: VAE, CWoLa, CATHODE, Tag N' Train, QUAK
- Promising performance in simulation
- No method to rule them all

Results to appear on CDS [link]

Finalizing analysis in data: stay tuned



#### **Input Features**

- VAE:  $p_T$ ,  $\eta$ ,  $\phi$  of leading 100 particle flow constituents (per jet)
- CWoLa, TNT:  $m_{SD}$ ,  $\tau_{21}$ ,  $\tau_{32}$ ,  $\tau_{43}$ ,  $n_{PF}$ , LSF<sub>3</sub>, b-tagging score (per jet)
- CATHODE: m<sub>SD1</sub>, m<sub>SD1</sub> m<sub>SD2</sub>, τ<sub>41,1</sub>, τ<sub>41,2</sub> (per event)
- **QUAK**:  $m_{SD}$ ,  $\tau_{21}$ ,  $\tau_{32}$ ,  $\tau_{43}$ ,  $\sqrt{\tau_{21}}/\tau_1$ ,  $M/p_T$  (for each jet, per event)

