

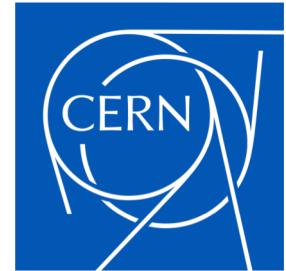
# MET Significance Study

Julia Hinds

CMSE 802 - 001

Michigan State University

April 26<sup>th</sup>, 2022

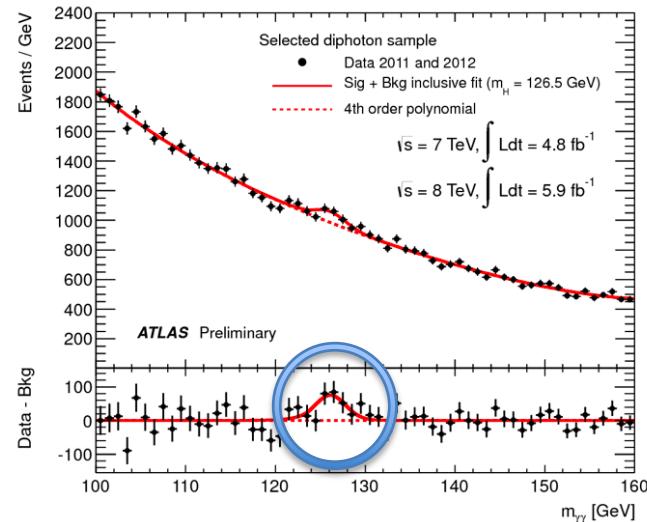




- What is particle physics?

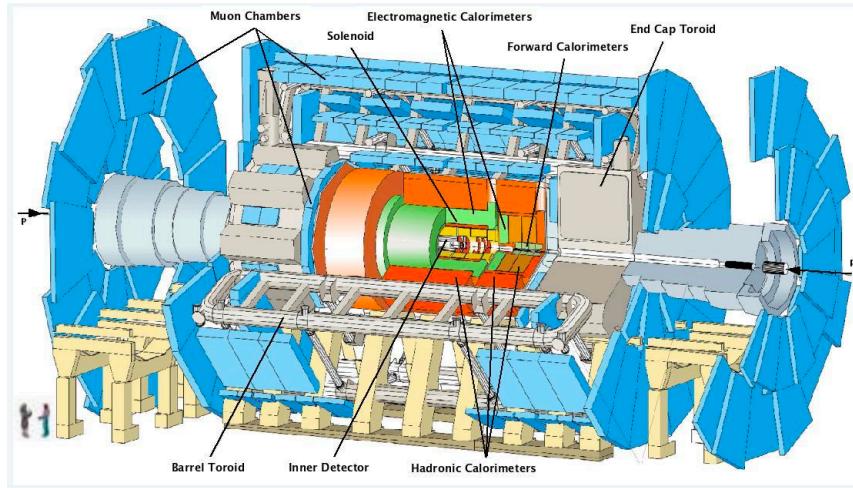
*“Like giant toddlers ... smashing things together to see what comes out”*

-Anonymous





- The European Organization for Nuclear Research (CERN), the Large Hadron Collider (LHC), and ATLAS (A Toroidal LHC ApparatuS)

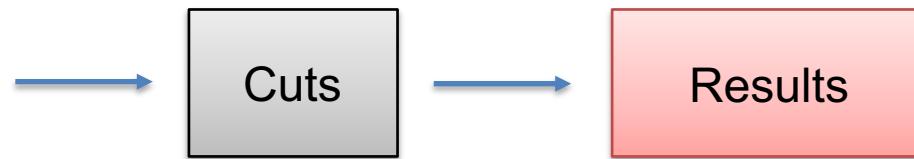
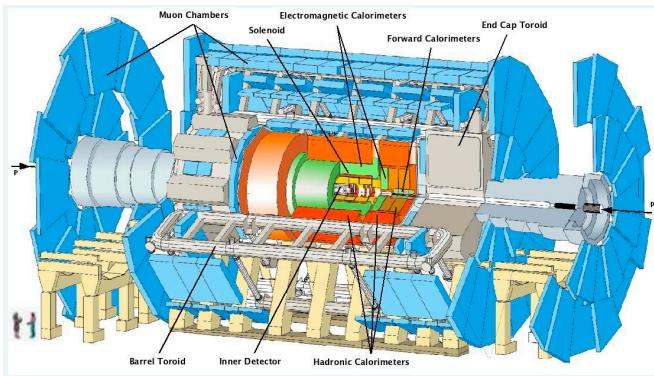


Forbes Magazine. <https://www.forbes.com/sites/startswithabang/2021/09/07/the-3-reasons-why-cerns-large-hadron-collider-can-t-make-particles-go-faster/?sh=3e360abf2aae> [Accessed October 6, 2021].

UCI Energy Blogs.  
<https://sites.uci.edu/energyobserver/2012/11/26/introduction-to-the-atlas-detector-at-the-lhc/> [Accessed October 6, 2021].



- Improve cuts which improve results!



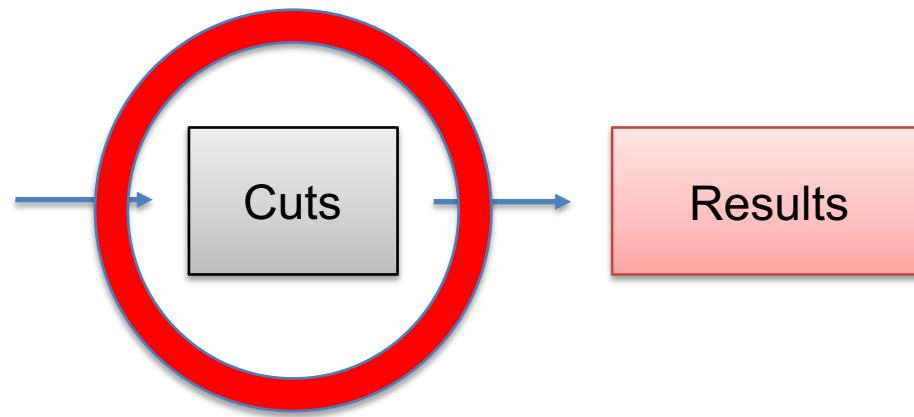
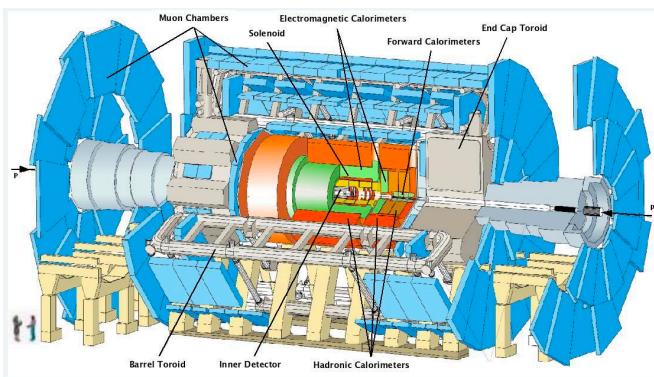
## Raw Data

UCI Energy Blogs.

<https://sites.uci.edu/energyobserver/2012/11/26/introduction-to-the-atlas-detector-at-the-lhc/> [Accessed October 6, 2021].



- Improve cuts which improve results!



Raw Data

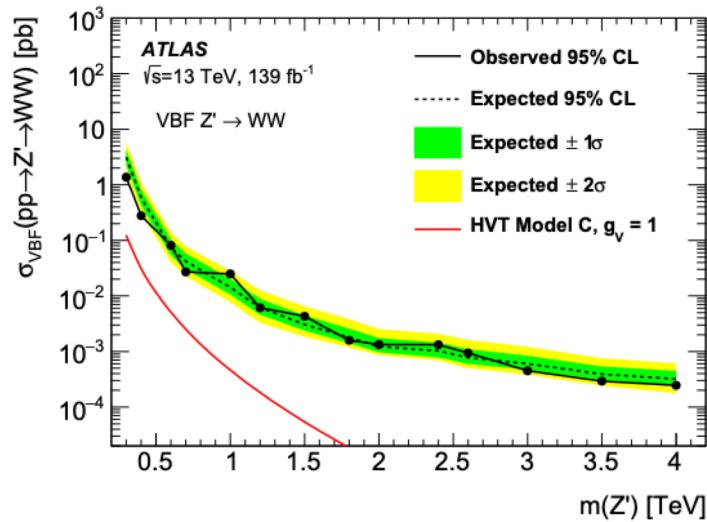
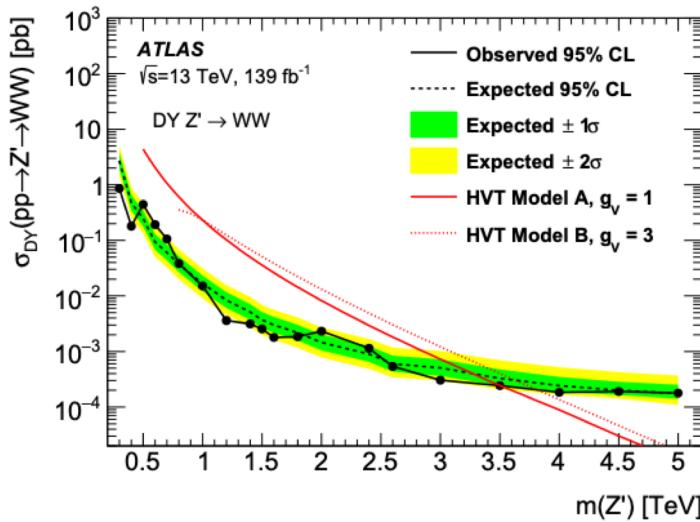
My work applies here!

UCI Energy Blogs.

<https://sites.uci.edu/energyobserver/2012/11/26/introduction-to-the-atlas-detector-at-the-lhc/> [Accessed October 6, 2021].



- What would improved sensitivity look like?
  - Example: previous analysis results
  - <https://arxiv.org/abs/2004.14636>



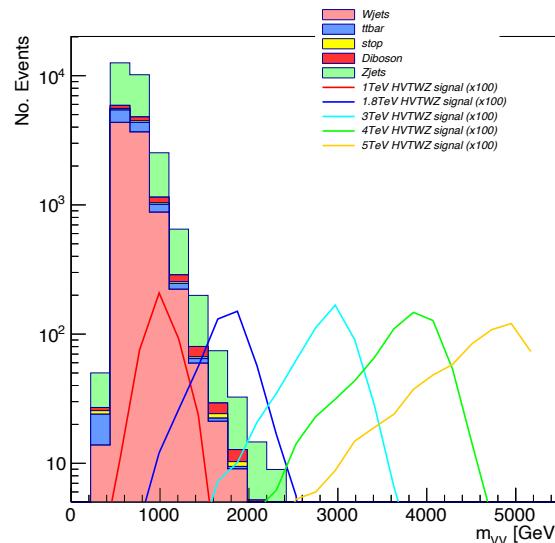
- My goal is to apply cuts to the MET Significance (one of the kinematic variables) to try to optimize the signal significance.
  - Introducing a new parameter to clean up end results

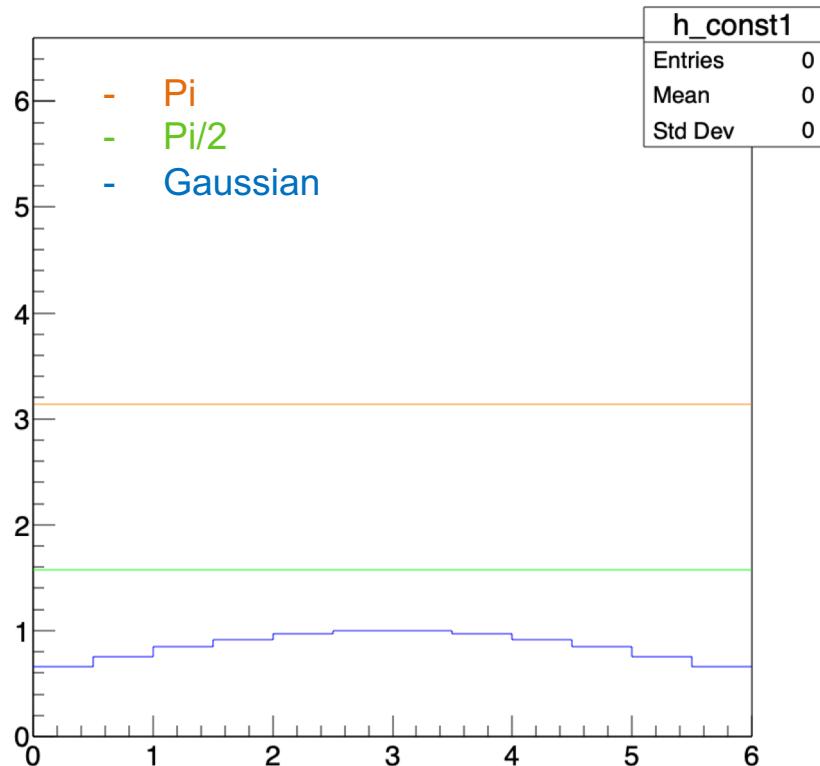
- Languages and packages
  - C++, ROOT, and Python were used
  - Matplotlib (Jupyter Notebook) and ROOT histograms were used for visualization
- Analysis Framework
  - METSignificanceStudy
    - <https://gitlab.msu.edu/hindsju1/metsignificancestudy>
  - Used to study the METSignificance variable and how the cuts impact the significance
  - Code developed in parallel for this project

- Analysis Framework
  - CutFlowProduction.C
    - Code that produces the cut flow of the analysis
    - The cut flow is a representation of how many events pass each sequential cut
  - VV\_VH\_distributions\_plotting.ipynb
    - Jupyter Notebook that plots 1D and 2D kinematic distributions
    - Used primarily for visualizations
  - METSigStudy.C
    - Main calculation of significance done
    - Plots the significance vs METSig cut for different signal masses



- Simplified Significance Equation:  $\sigma = \sum \sigma_i^2$ 
  - Where  $\sigma_i = \frac{s_i}{\sqrt{s_i+b_i+\delta^2}}$  significance per bin; and,  $s_i$  = signal per bin,  $b_i$  = total background per bin,  $\delta$  is the uncertainty in the bin

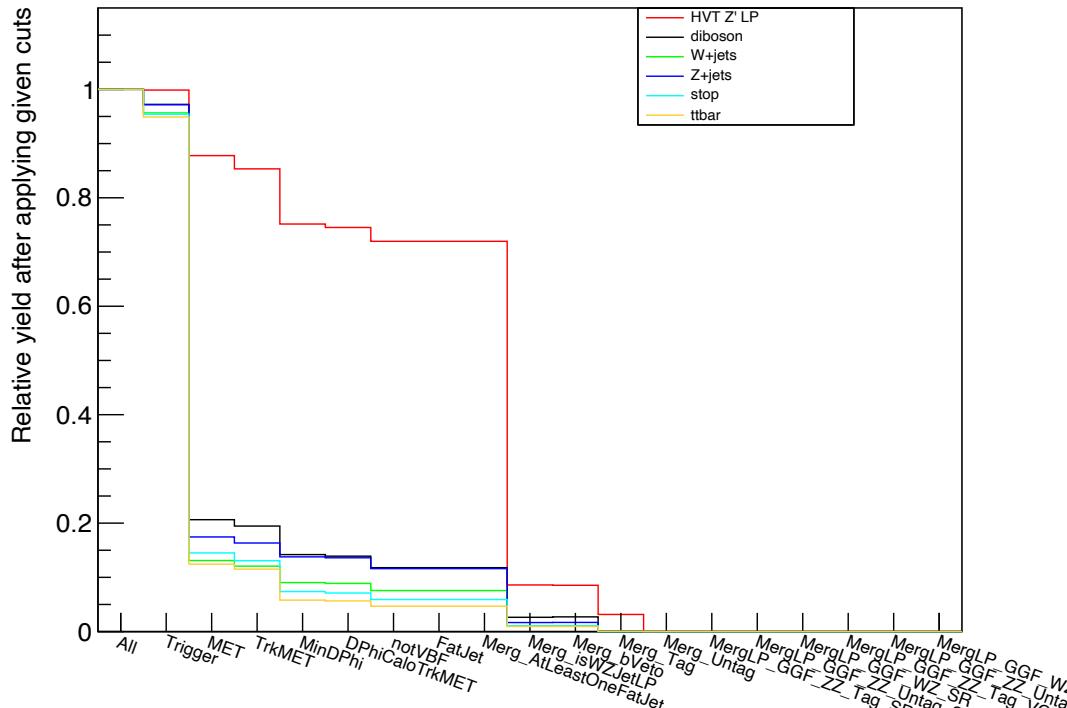




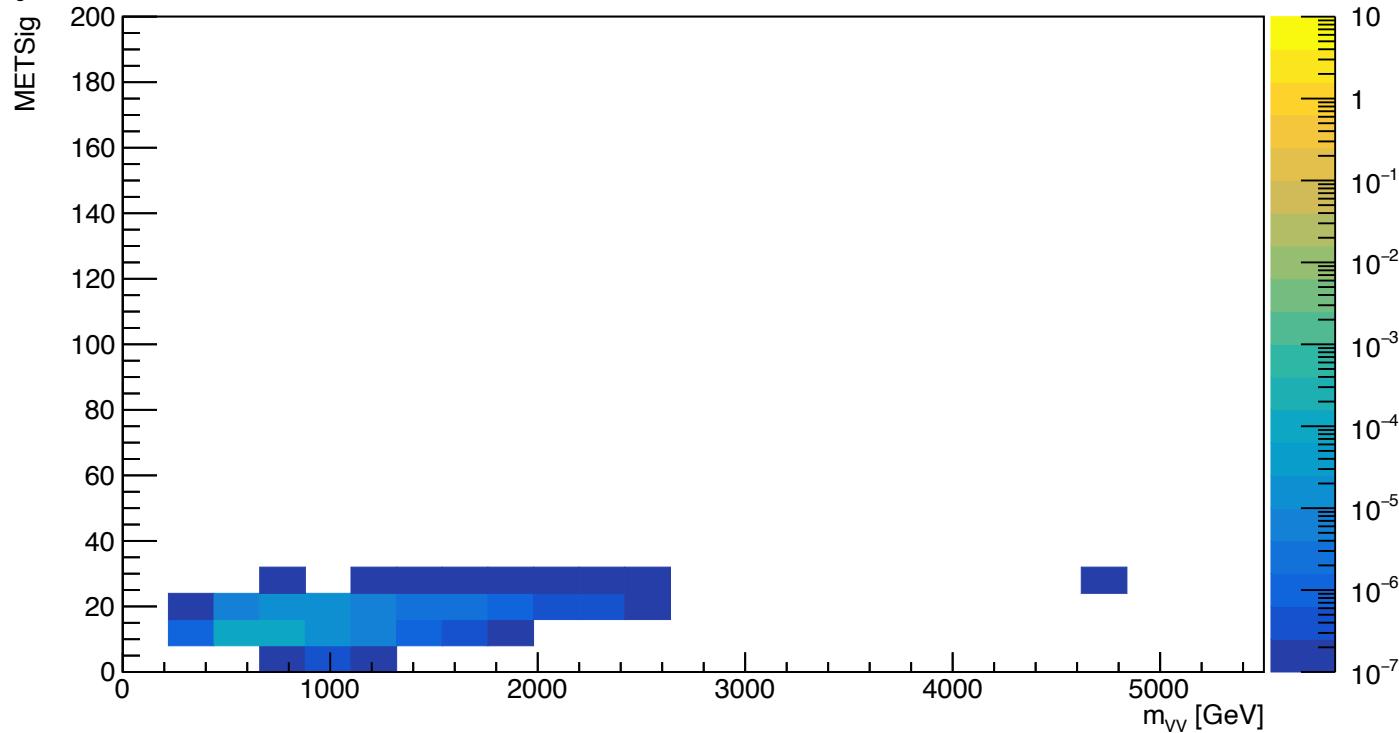
- Unit testing for ROOT and C++ is very difficult – created own “pseudo-tests”
  - Tested edge cases (empty histograms being passed, signal histogram not passed, etc.)
  - Tested values for specific cases
    - Used generic ROOT histograms and calculated the significance by hand and compared



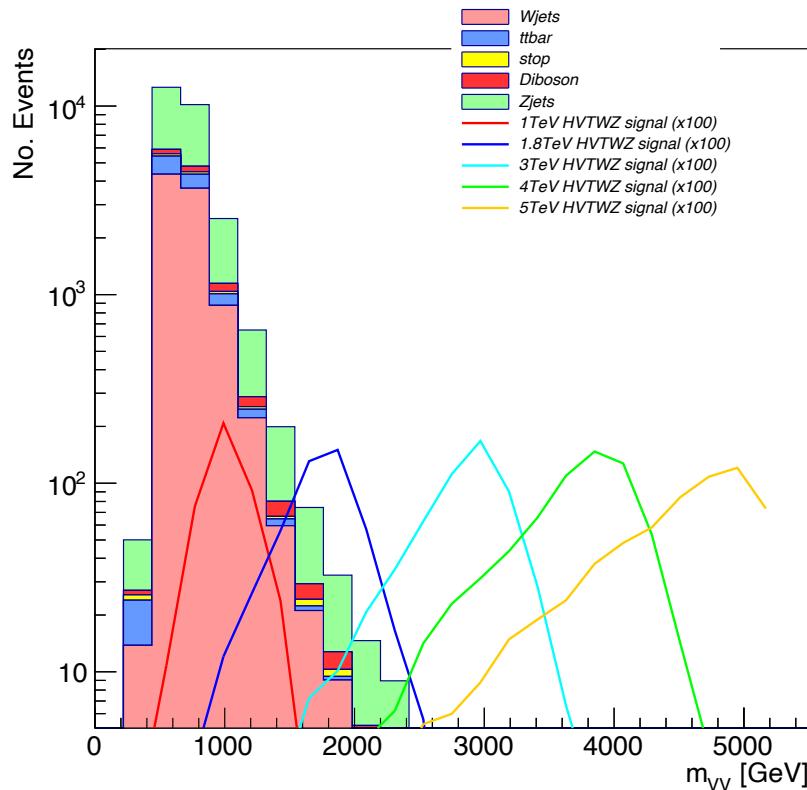
### Merged\_GGF\_LP\_CutFlowCuts



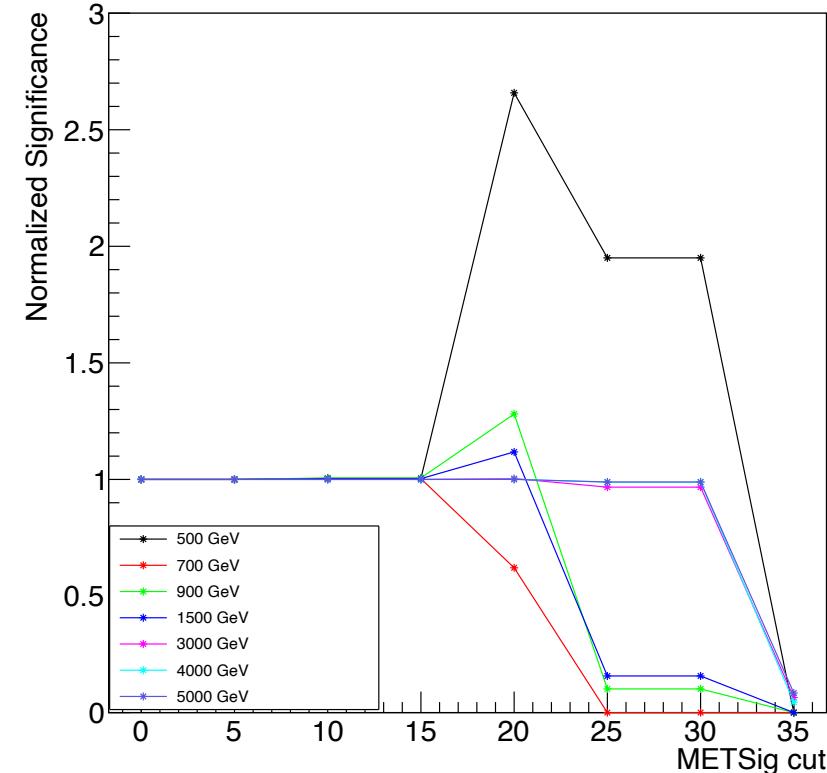
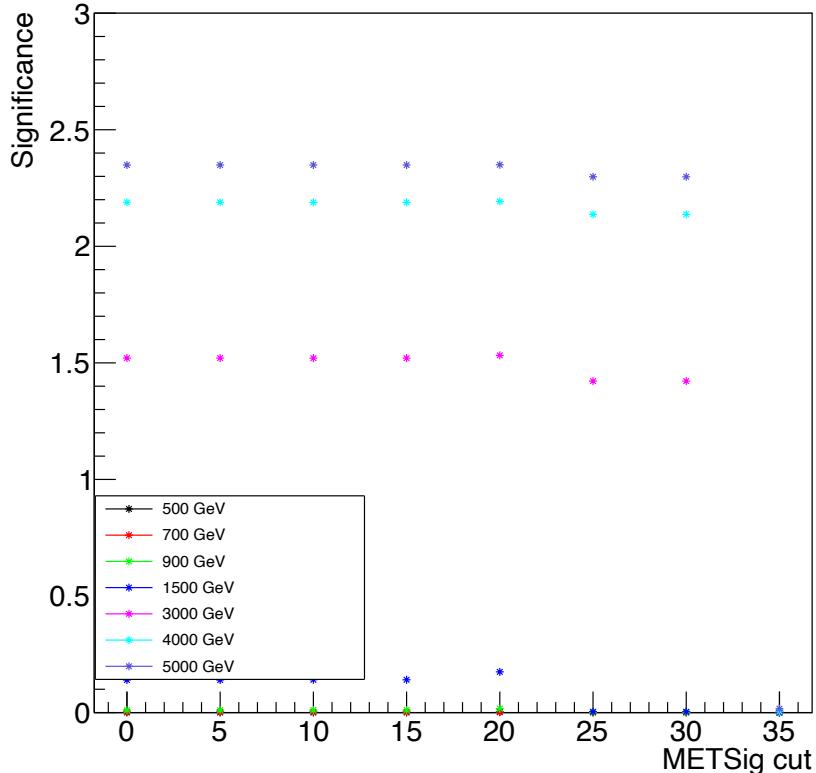
Z+jets only



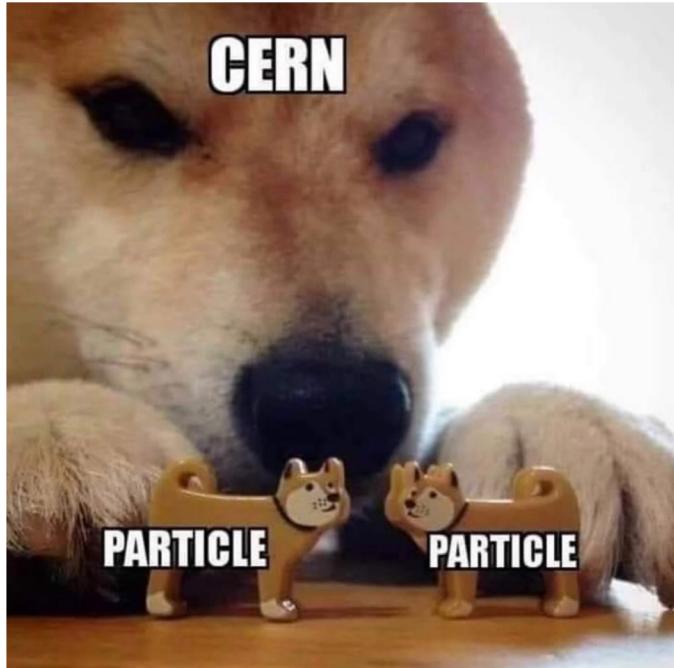
METSig cut = 0



# Results – VV PFlow+UFO HVT LP no-tag



- Developed code to analyze MET Significance cuts affect on the signal significance
- Possible improved sensitivity between a METSig cut of 15 – 25
- Next Steps,
  - Produce finer binning to find an approximate cut
  - Apply ML to see if it can find an optimal cut with all signal masses
  - Replace previous cuts with this improved cut to see if sensitivity is gained





# Back up



- The European Organization for Nuclear Research (CERN), the Large Hadron Collider (LHC), and ATLAS (A Toroidal LHC ApparatuS)

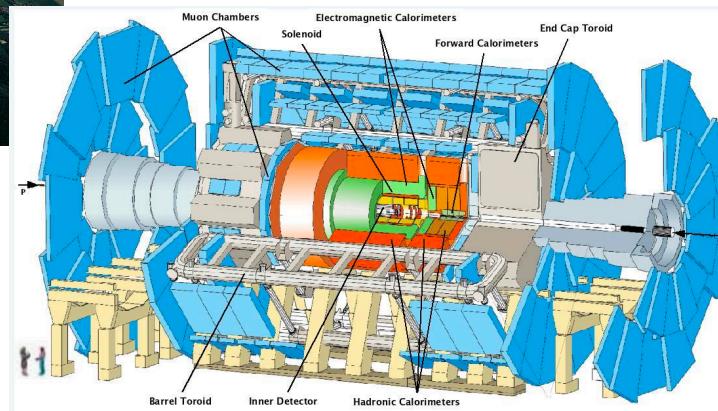


- CERN & LHC

- Largest particle physics laboratory in the world
- 27 kilometer circumference
- 4 major detectors (**ATLAS**, CMS, ALICE, LHCb)
- No. collisions per second: 1 billion

- ATLAS

- General purpose detector at the LHC
- 45 meters in length
- 25 meters in diameter
- Weighs over 7000 tons
- 100 meters below ground

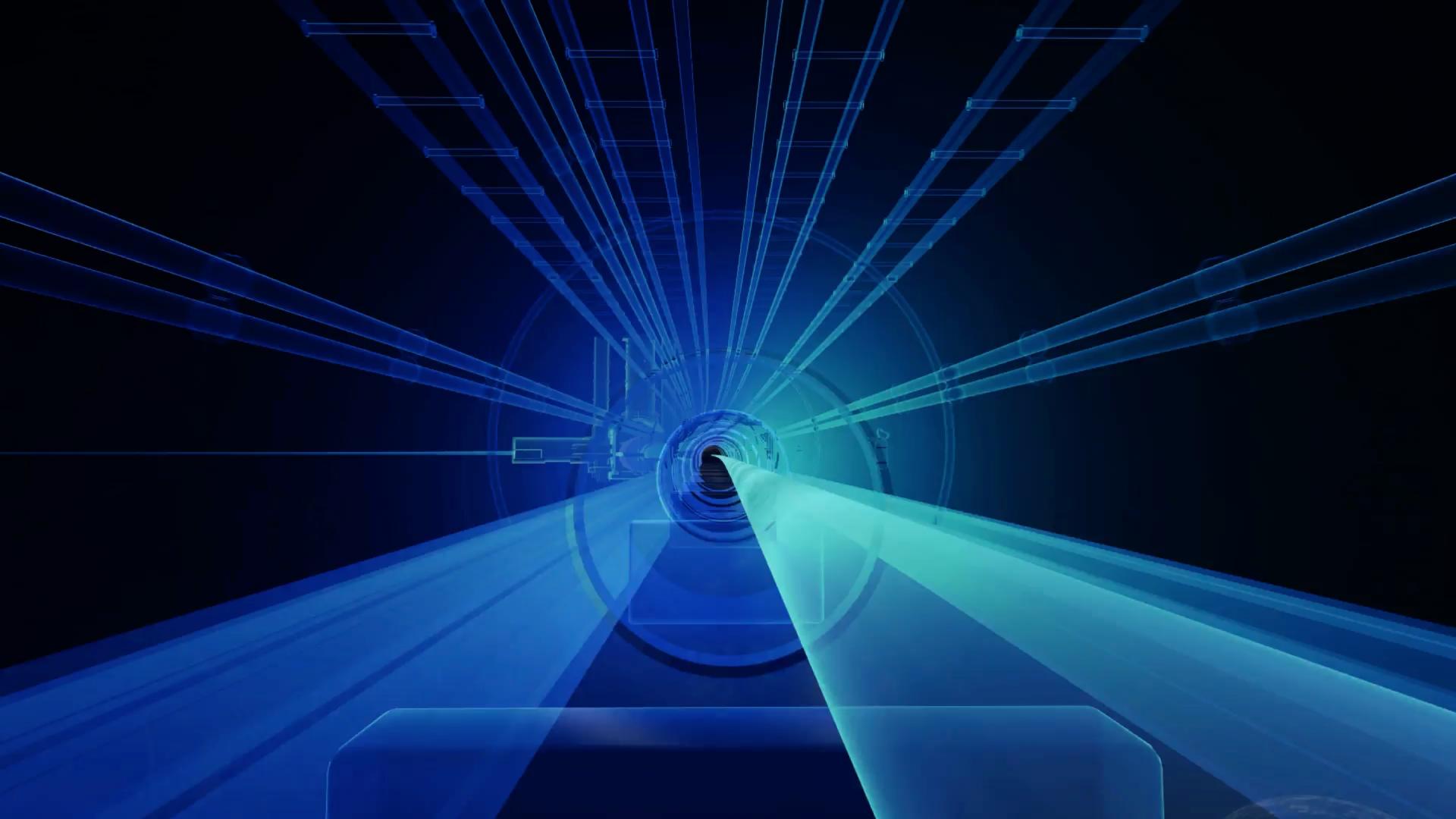


Forbes Magazine.

<https://www.forbes.com/sites/startswithabang/2021/09/07/the-3-reasons-why-cerns-large-hadron-collider-cant-make-particles-go-faster/?sh=3e360abf2aae> [Accessed October 6, 2021].

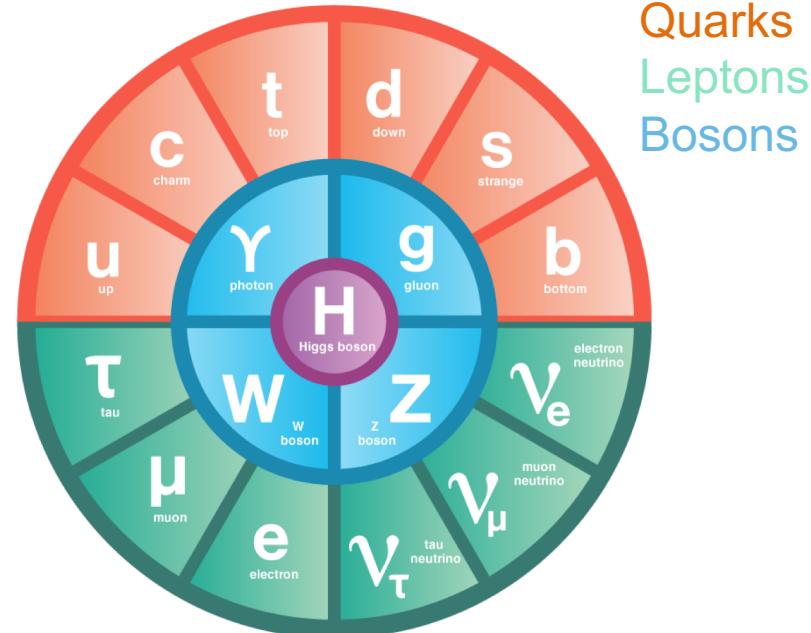
UCI Energy Blogs.

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- Standard model (SM) theory
  - Theory that describes all of the fundamental particles that we have observed so far
  - Can be categorize and describe interactions
- Need for beyond standard model (BSM)
  - Are we missing any particles?
  - Is there a gravity force carrier?
  - How does dark matter fit in?
  - Is there anything more fundamental?
  - Is there a point where we have all the forces unified together?
    - 
    - 
    -

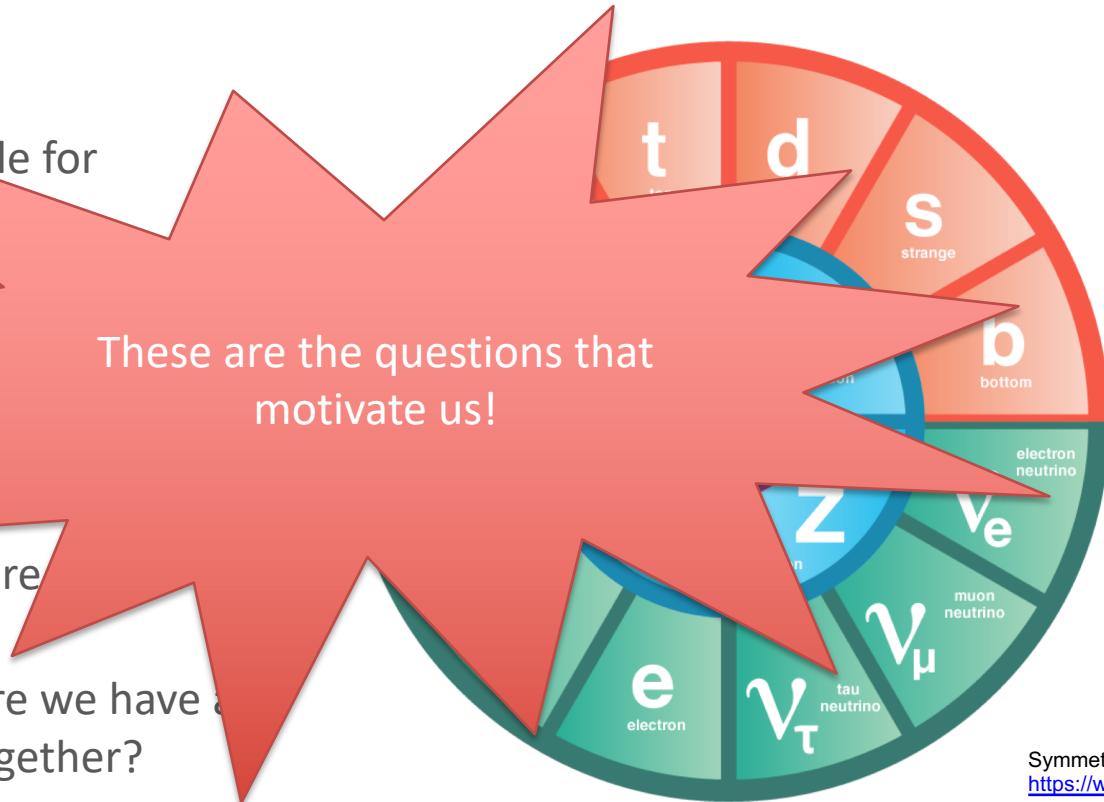


Symmetry Magazine.  
<https://www.symmetrymagazine.org/standard-model/>  
[Accessed October 6, 2021].



- Standard model
  - Like the periodic table for fundamental particles
- Questions you could ask
  - Are we missing something?
  - Is there a gravity particle?
  - How does dark matter interact?
  - Is there anything more fundamental?
  - Is there a point where we have a theory of everything that unifies all the forces?
  - .
  - .
  - .

These are the questions that motivate us!

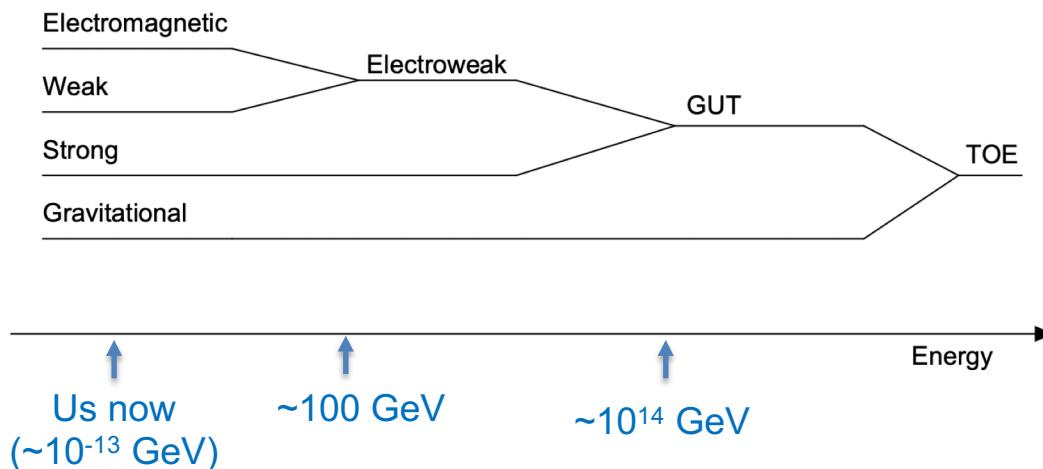


Symmetry Magazine.  
<https://www.symmetrymagazine.org/standard-model/>  
[Accessed October 6, 2021].

- My questions: Is there a point where we have all the SM forces unified together? Is there a gravity force carrier?
- To answer this, we'll need new physics models (experimental inputs)
  - Grand Unified Theory
  - Quantum gravity/Graviton
- We need experimental input to understand these models better
  - Maybe exclude some of the theories (need measurements to determine which theories are wild, and which ones are wild and plausible!)
  - Important to note, even if we don't find something, that can still help exclude certain parts of the theory!

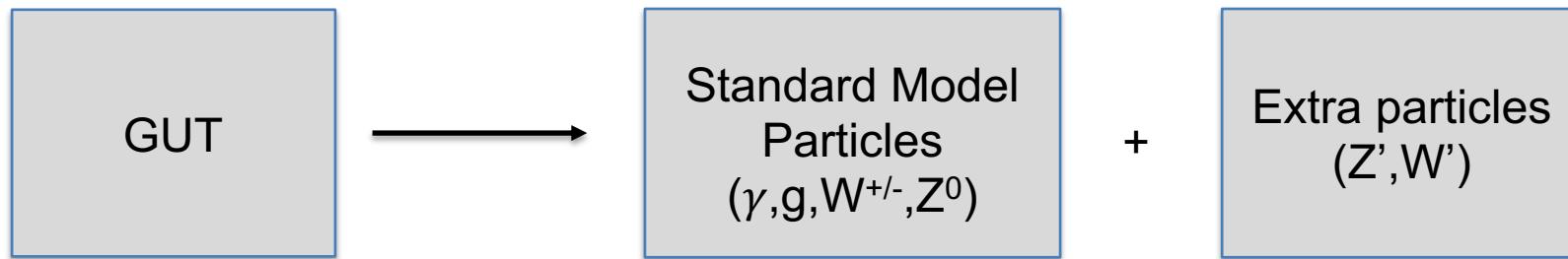


- Question: Is there a point where we have all the SM forces unified together?
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  - A model where at high energies, the electromagnetic, weak, and strong forces merge into a single force





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- Observing these new particles could provide evidence of unification at a higher energy

- Question: Is there a gravity force carrier?
- Quantum Gravity/Graviton
  - Hypothetical spin-2 particle that mediates the gravitational force
  - But first, let's talk about dimensionality...

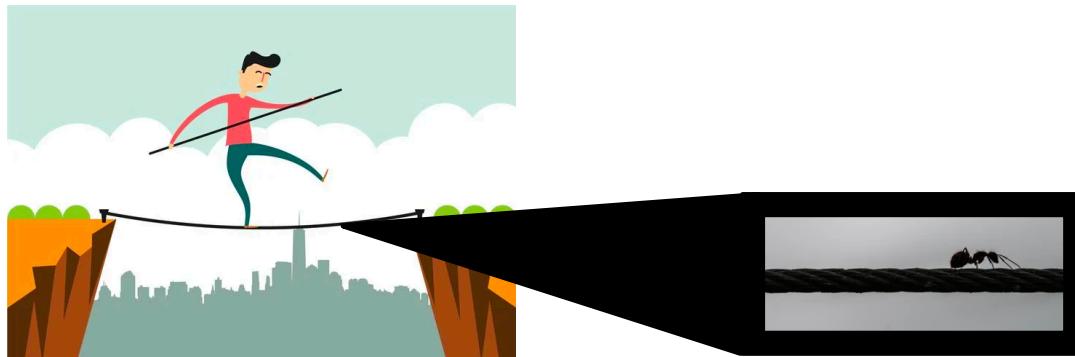
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Vecteezy. <https://www.vecteezy.com/vector-art/152799-tightrope-walker-over-city-buildings> [Accessed October 13 2021].



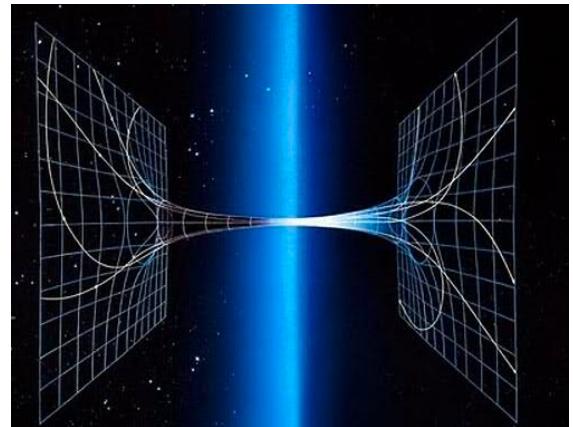
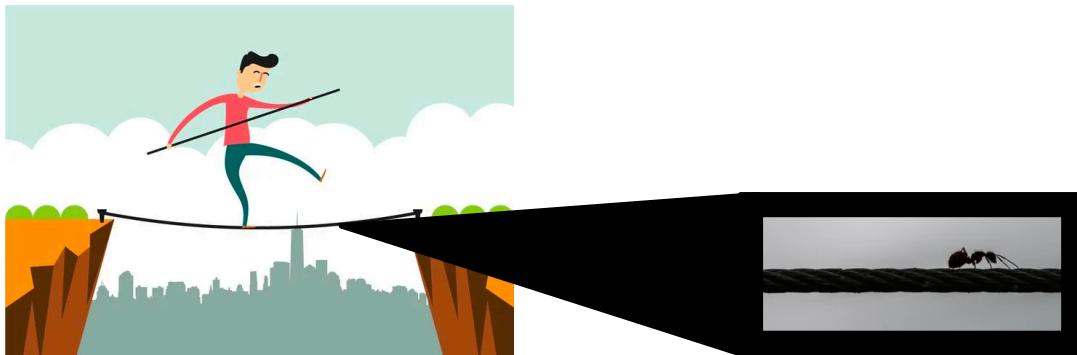
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Shutterstock. <https://www.shutterstock.com/image-photo/ant-on-tightrope-1445223776> [Accessed October 13 2021].

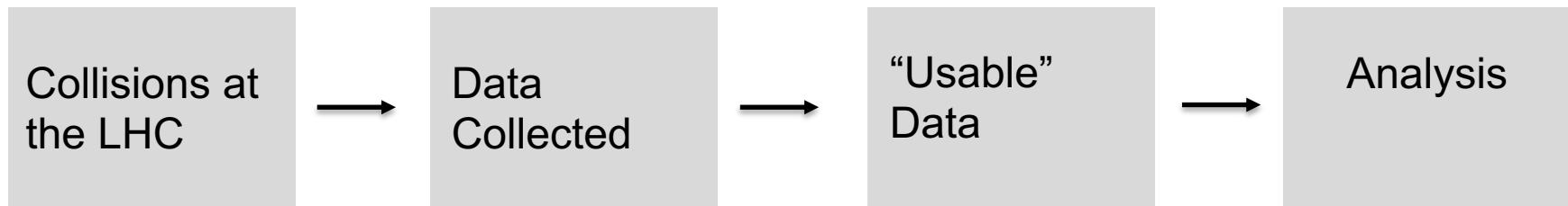


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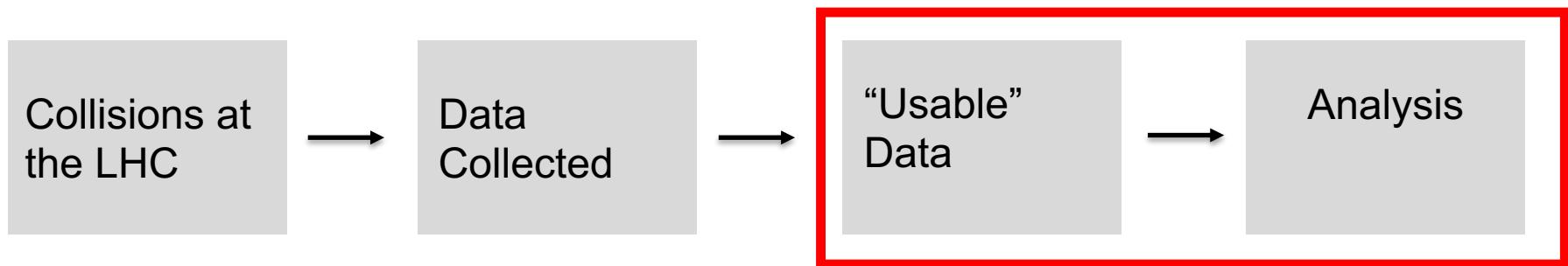


Vecteezy. <https://www.vecteezy.com/vector-art/152799-tightrope-walker-over-city-buildings> [Accessed October 13 2021].  
Shutterstock. <https://www.shutterstock.com/image-photo/ant-on-tightrope-1445223776> [Accessed October 13 2021].  
Scribal Multiverse. <http://www.scribalmultiverse.com/brane-worlds-and-higher-dimensions/> [Accessed October 13 2021].

- How do you “detect” this new physics?



- How do you “detect” this new physics?



Where I come in

## VV-Semileptonic Analysis

- Search for new particles which decay into a semileptonic final state
- VV – one hadronic and one leptonic decay
  - Where VV can be WW, WZ, or ZZ ( $V = W, Z$ )
  - Hadronic decay allows for higher cross section and leptonic decay allows for a clearer signal
- Signal models
  - Spin-0: Scalar “Radion”
  - Spin-1: Heavy vector triplet (HVT)  $W'/Z'$
  - Spin-2: Randall-Sundrum Graviton
- Production
  - Gluon-gluon fusion (ggF)
  - Quark-quark annihilation (Drell-Yan)
  - Vector-boson fusion (VBF)



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Main focus for now



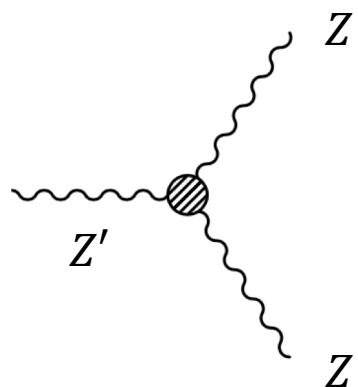
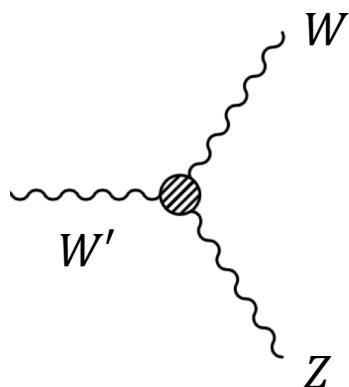
- Signal models
  - Heavy vector triplet (HVT) model
    - Heavy gauge bosons ( $W'$ ,  $Z'$ )

Three distinct channels:

0-lepton:  $ZV \rightarrow \nu\nu qq$

1-lepton:  $WV \rightarrow l\nu qq$

2-lepton:  $ZV \rightarrow ll qq$



$$Z \rightarrow \nu\nu$$

$$Z \rightarrow ll$$

$$W \rightarrow l\nu$$

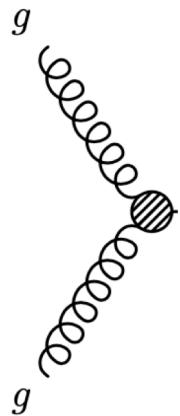


## VV-Semileptonic Analysis

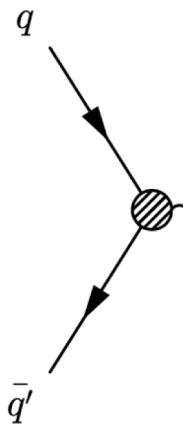
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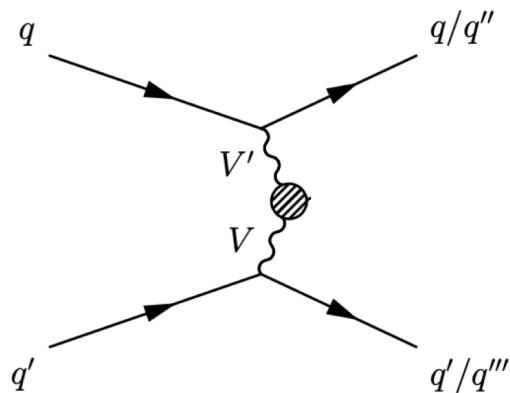
- VV-Semileptonic Analysis



gluon-gluon fusion  
(ggF)



Drell-Yan (DY)



Vector-boson fusion  
(VBF)

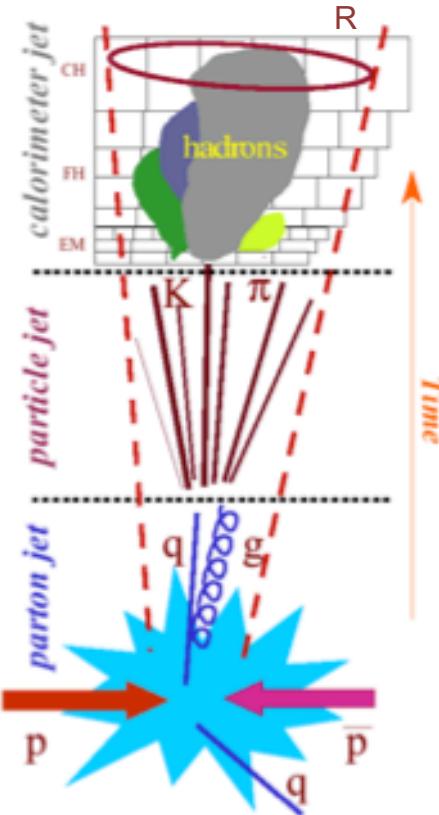


# Definitions

- Collecting final state particles
  - Jets are particles collected from the same source
  - Jet size is dependent on cone size, R
    - “rule of thumb”  $R = 2m/p_T$
    - Large-R jet R=1.0
    - Small-R jet R=0.4
  - Parton jet: physics interaction
  - Particle jet: added tracks from underlying event
  - Calorimeter: measuring energy of neutral or charged particle

Loch, Peter. US-ATLAS mini-course on Jets.

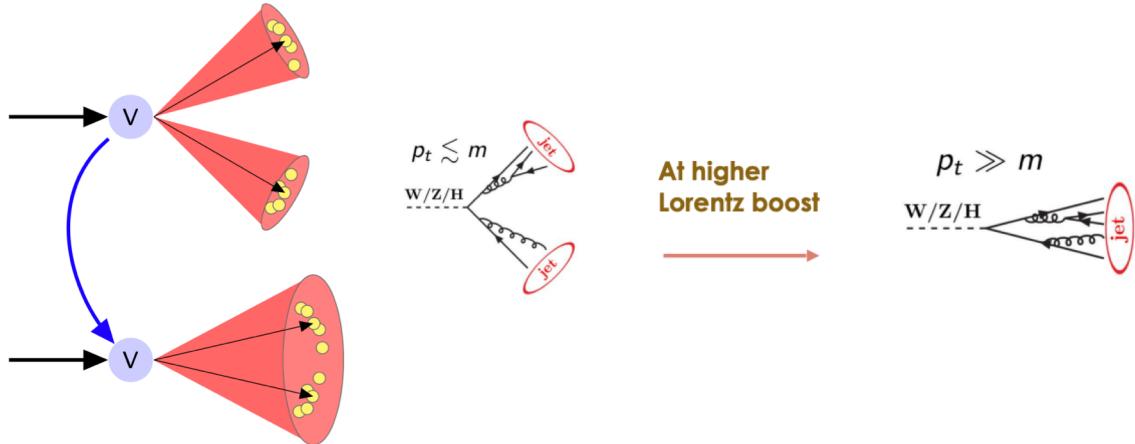
<https://indico.cern.ch/event/1054786/> [Accessed October 1, 2021].





# Definitions

- Resolved
  - Two small R-jets
- Merged
  - One large R-jet
  - Only merged used here
- Missing  $E_T$  (MET or  $E_T^{miss}$ )
  - Reconstructed by negative sum of the all physics objects and ID tracks not associated with them in the transverse direction (should sum to zero)
  - Neutrinos don't show up in detector, so when look at energy conservation there will be energy missing, i.e. neutrino energy



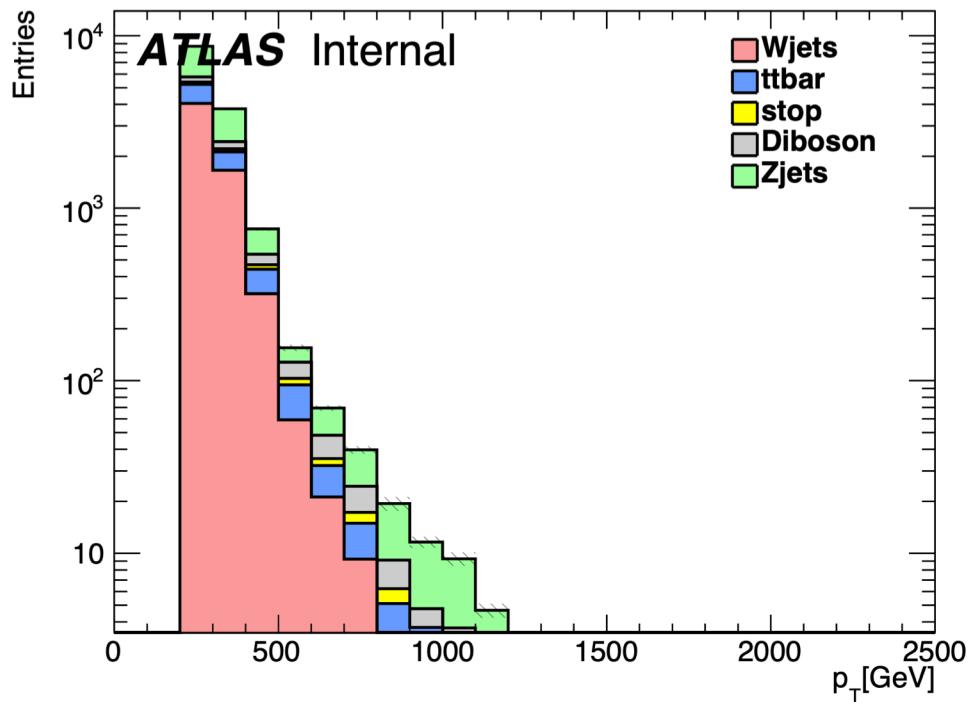


- Purity
  - High (HP) or Low (LP) depends on passing and/or failing the boson tagging requirement
- Signal Regions (SR)
  - Try to maximize signal, minimize background
  - Strict cuts, with one of those cuts requiring boson tagging.
- Control Regions (CR or VCR)
  - Regions which look very similar to the signal region but have some slightly different selection to enrich a particular background (i.e. V boson), which is orthogonal to the signal region



# Definitions

- Backgrounds



- SM processes can “mimic” signals, i.e. have same final states (pass event selection)



# Definitions

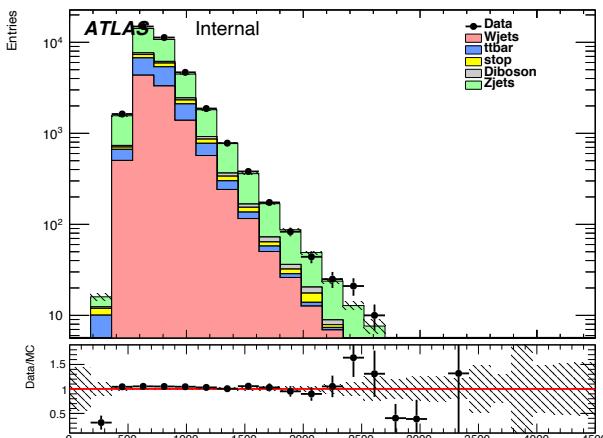
- Jet Collections
  - Small-R jet
    - EMTopo (Electromagnetic Topological)
    - PFlow (Particle Flow)
  - Large-R jet
    - TCC (Track Calo Clusters)
    - LCTopo (Local Call Topological)
    - UFO (Unified Flow Object)
  - Compare the 3 large-R jet collections with respect to each other only
- Previous analysis used EMTopo with LCTopo and TCC, new jet collection algorithm is PFlow with UFO
  - My immediate goal is to determine if there are any improvements to the analysis by switching to Pflow/UFO



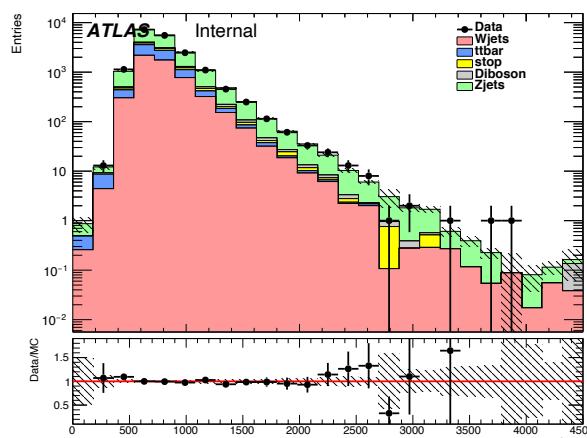
H.C. Berg. Private communication. 2021.

- Investigating some of the ways that we can reconstruct jets with the ATLAS detector to see if they bring improvement to the analysis

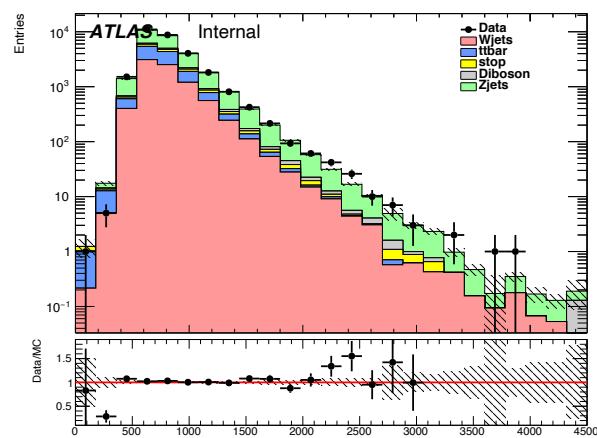
## VCR – ggF – HP (Invariant mass)



PFlow UFO

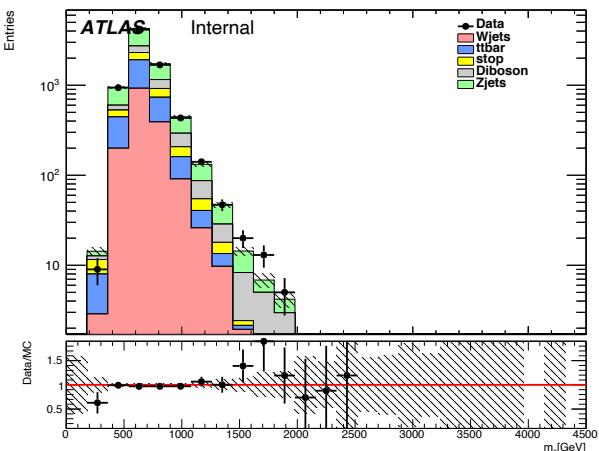


EMTopo TCC

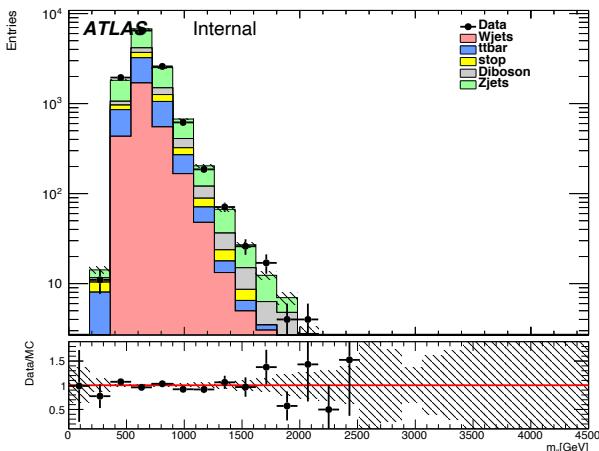


EMTopo LCTopo

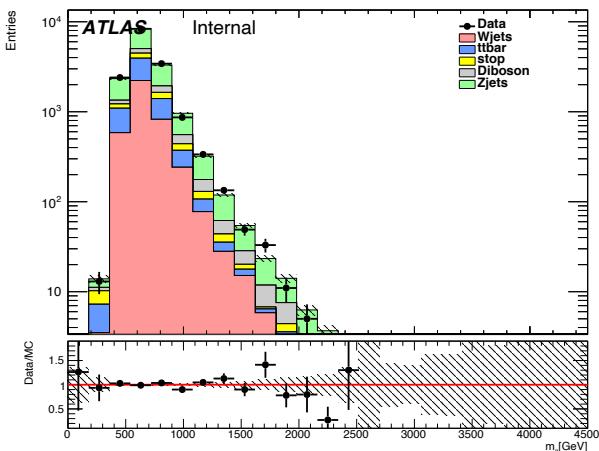
## SR – ggF – HP (Invariant mass)



PFlow UFO



EMTopo TCC



EMTopo LCTopo

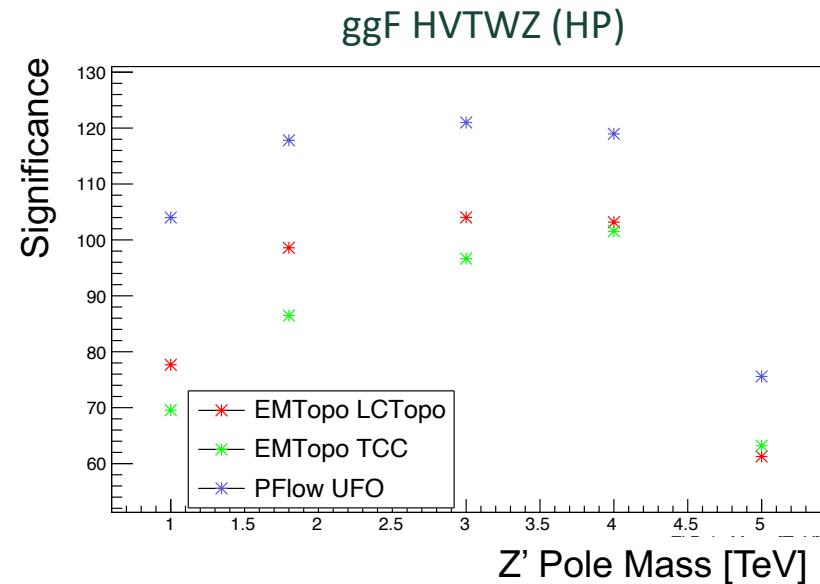
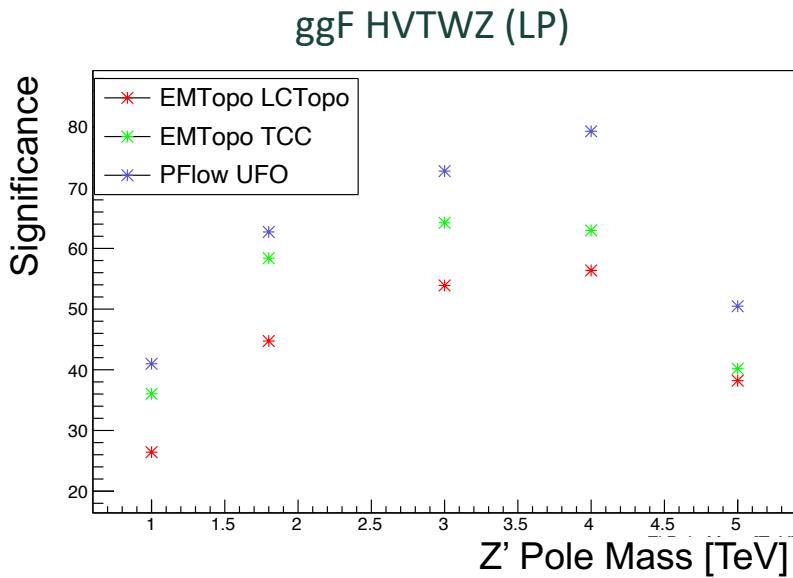
- Also compared  $p_T$ ,  $m_{jj}$ ,  $D_2$ , MET for ggF and VBF (HP and LP)

# Significance study



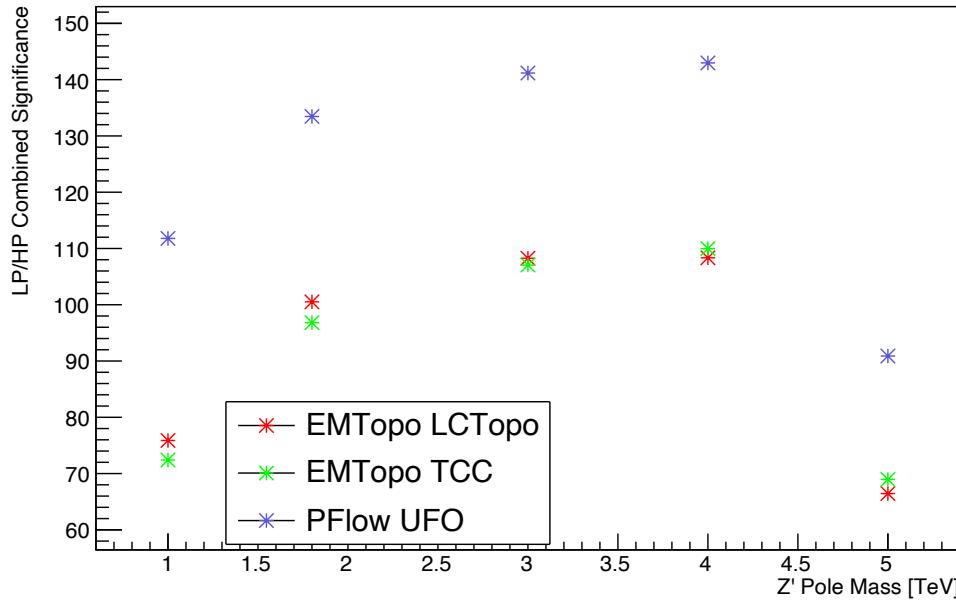
MICHIGAN STATE UNIVERSITY

- Simplified Significance Equation:  $\sigma = \sum \sigma_i^2$ 
  - Where  $\sigma_i = \frac{s_i}{\sqrt{s_i+b_i}}$  significance per bin; and,  $s_i$  = signal per bin,  $b_i$  = total background per bin



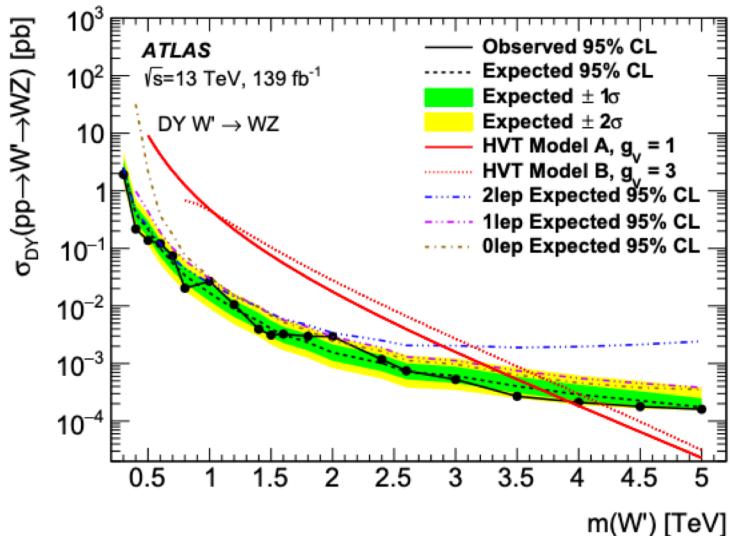


### ggF HVTWZ (combined LP/HP)

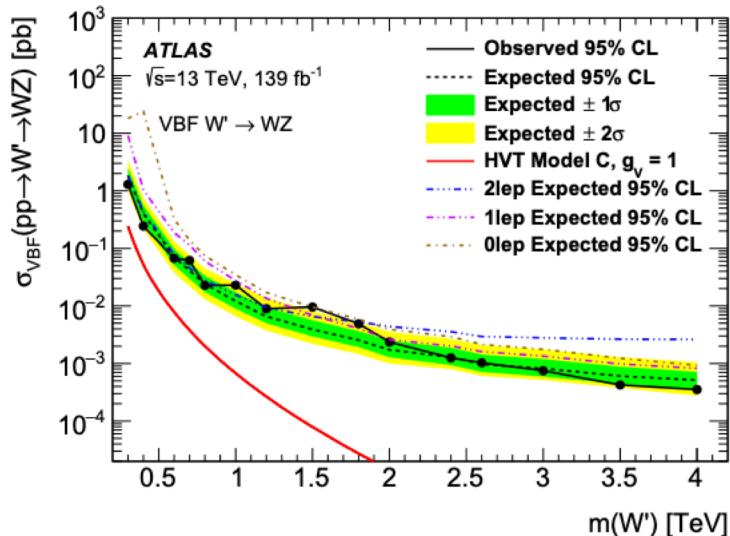




### Drell-Yan production



### VBF production



- Observed (black solid curve) and expected (black dashed curve) 95% CL upper limits on the DY (left) and VBF (right) production cross-section of an HVT  $W'$  boson at  $\sqrt{s} = 13$  TeV in the  $WZ$  decay mode as functions of its mass, combining searches in the three leptonic channels



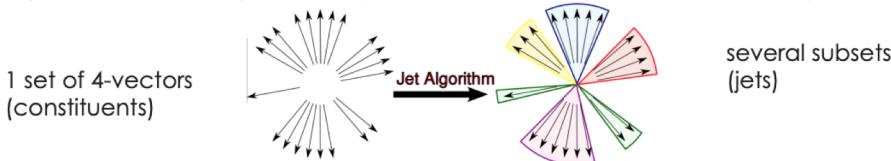
# Next Steps

- Immediate
  - Obtain results for each signal models
    - Spin-0: Scalar “Radion”
    - Spin-1: Heavy vector triplet (HVT)  $W'/Z'$  (shown in this presentation)
    - Spin-2: Randall-Sundrum Graviton
  - Scale down the signal (picobarn  $\rightarrow$  femtobarn cross-section)
  - Investigate other 0-lepton improvements
    - MET significance study
      - CMSE 801 final project
- Future
  - Look into other studies as needed – possible improvements from ML approaches
  - Main analyzer for the 0-lep channel
  - Hopefully publish in 2022



# JET FINDING ALGORITHM

Use a jet algorithm to cluster objects into a jet: It maps final state particle momenta to jet momenta.

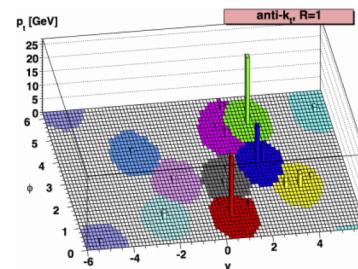


- The Anti- $R$  is the most widely used jet algorithm

Requires an external parameter, the jet radius  $R$ , which specifies up to which angle separate partons are recombined into a single jet.

Depending on physics intent, different size of jets radii are useful

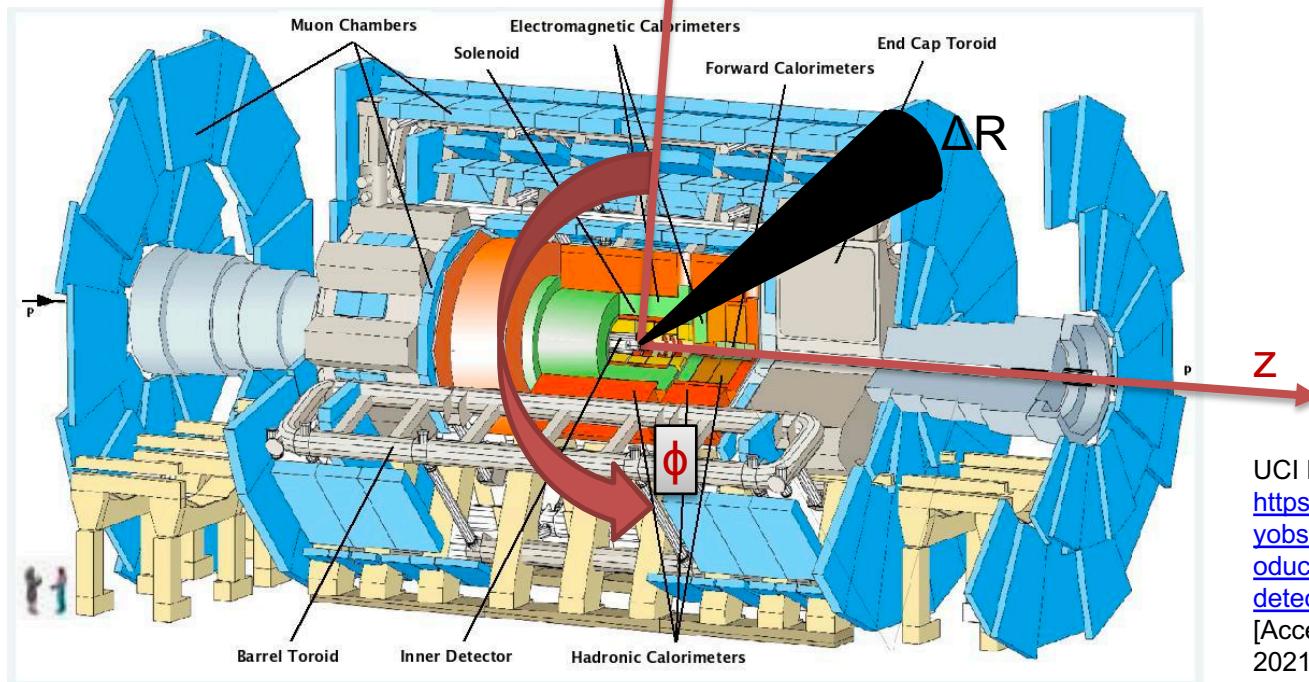
- \* CMS: 0.4, 0.8
- \* ATLAS: 0.4, 1.0



4



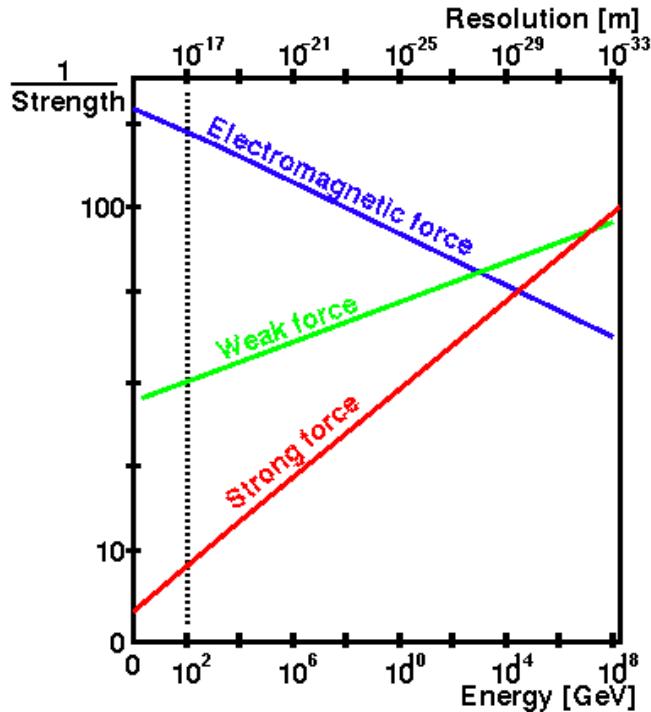
- $\Delta R = \sqrt{\Delta\eta^2 + \Delta\phi^2}$



UCI Energy Blogs.  
<https://sites.uci.edu/energyobserver/2012/11/26/introduction-to-the-atlas-detector-at-the-lhc/>  
[Accessed October 6, 2021].



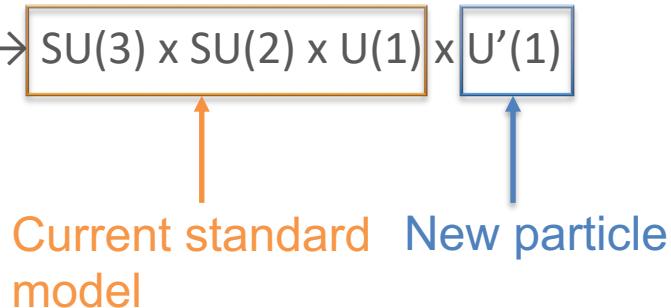
- Running coupling constants





- Example of GUT that has failed

- $SU(5) \rightarrow SU(3) \times SU(2) \times U(1) \times U'(1)$



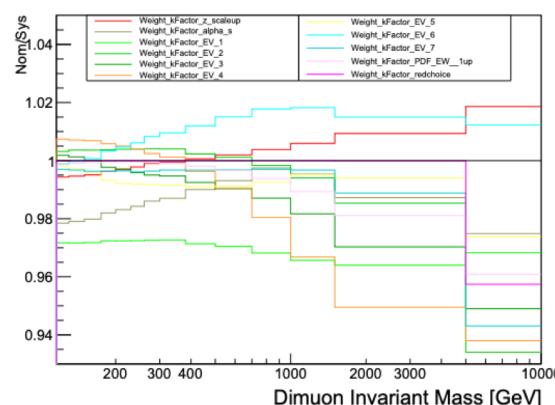
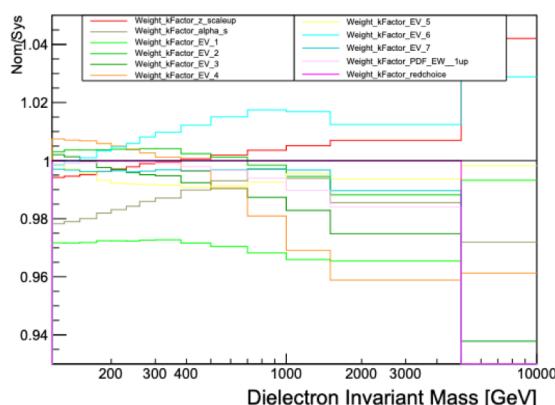
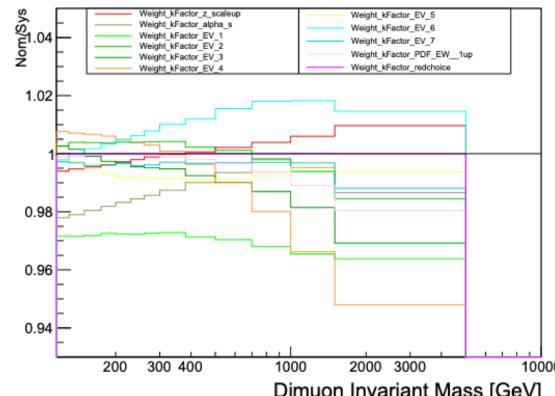
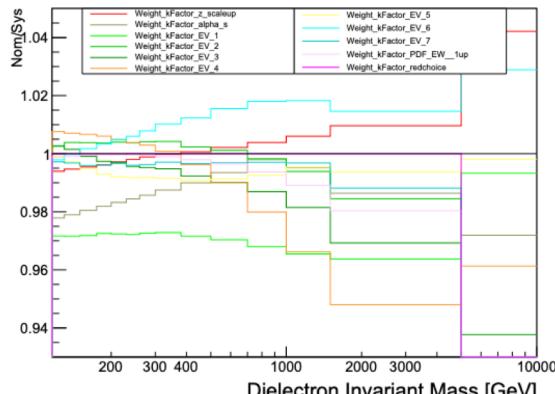
- False because requires the proton is unstable
  - We have evidence that the proton is stable

- Support note: <https://cds.cern.ch/record/2703975/files/ATL-COM-PHYS-2019-1455.pdf>
- Theoretical uncertainties in the  $Z/\gamma^*$  prediction arise from the PDF uncertainty, the renormalisation and factorisation scale choices, as well as the value of the strong coupling constant  $\alpha_s$ , and higher-order corrections

# HMDY Theory Uncertainties



MICHIGAN STATE UNIVERSITY



## Code and Documentation

- GitHub repo for CxAODReader:  
[https://gitlab.cern.ch/CxAODFramework/CxAODReader\\_VVSemileptonic](https://gitlab.cern.ch/CxAODFramework/CxAODReader_VVSemileptonic)
- Derivation: HIGG5D1 (0 lep-channel)
- EasyTreePlotter:  
<https://gitlab.cern.ch/rles/easytreeplotter/-/blob/master/README.md>
- b-tagger
  - DL1r used for UFO
  - MV2c10 used for LCTTopo and TCC

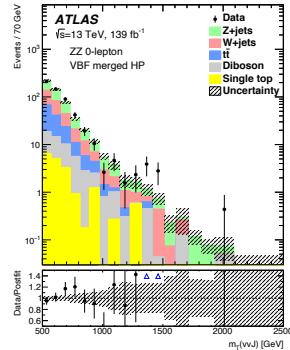
# Regions

- V - Control Region (VCR)
  - Fails invariant mass cut
  - Low Purity (LP)
    - Fails  $D_2^{(\beta=1)}$  requirement of boson tagging
  - High Purity (HP)
    - Passes  $D_2^{(\beta=1)}$  requirement of boson tagging
- Signal Region (SR)
  - Passes invariant mass cut
  - Low Purity (LP)
    - Passes  $D_2^{(\beta=1)}$  requirement of boson tagging
  - High Purity (HP)
    - Fails  $D_2^{(\beta=1)}$  requirement of boson tagging

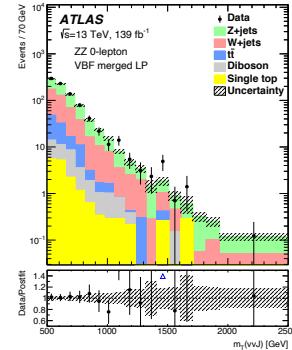
Selection	SR		VR	
	HP	LP	HP	LP
Number of Loose leptons				0
$E_T^{\text{miss}}$				$> 250 \text{ GeV}$
$p_T^{\text{miss}}$				$> 50 \text{ GeV}$
$\min(\Delta\Phi(E_T^{\text{miss}}, \text{small-R jets}))$				$> 0.4$
$\Delta\Phi(E_T^{\text{miss}}, p_T^{\text{miss}})$				$< 1$
Number of large-R jets	$\geq 1$ large-R jets			
$D_2$ cut	pass	fail	pass	fail
$W/Z$ mass window cut	pass	pass	$m_J > 50 \text{ GeV}$ , fail mass window cut	
Numb. of associated VR track jets $b$ -tagged	For $Z \rightarrow J$ : $\leq 1$ ( $= 2$ ) for untagged (tagged) category			



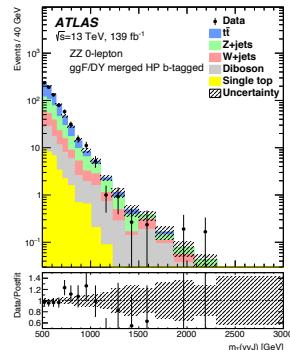
Event selection	0-lepton ( $ZV \rightarrow \nu\nu V_h$ )	1-lepton ( $WV \rightarrow \ell\nu V_h$ )	2-lepton ( $ZV \rightarrow \ell\ell V_h$ )	
$V_\ell$ selection	No <i>Loose</i> lepton $E_T^{\text{miss}} > 250 \text{ GeV}$ $p_T^{\text{miss}} > 50 \text{ GeV}$	1 <i>Tight</i> electron or 1 <i>Medium</i> muon with $p_T^\ell > 30 \text{ GeV}$ $E_T^{\text{miss}} > 60 \text{ GeV}$ $p_T^{V_\ell} > 75 \text{ GeV}$	2 <i>Loose</i> leptons with $p_T^\ell > 30 \text{ GeV}$ from the $Z \rightarrow \ell\ell$ candidate	
Event veto	No additional <i>Loose</i> leptons Veto events with $b$ -jets not associated with the $Z \rightarrow qq$ candidate			
Event categorisation	$\geq 1$ large- $R$ jets or $\geq 2$ small- $R$ jets VBF and ggF/DY classification according to RNN score			
$V_h$ selection (Merged)	$E_T^{\text{miss}} > 100 \text{ GeV}$ $p_T^{V_\ell} > 200 \text{ GeV}$		$\geq 1$ large- $R$ jets	
	The leading jet passing $p_T$ -dependent $m_J$ requirement			
	$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)		$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)	
$V_h$ selection (Resolved)	Not Performed	Failed merged selection $\geq 2$ small- $R$ jets with $ \eta  < 2.5$ $62 < m_{jj} < 97 \text{ GeV}$ for $W \rightarrow jj$ $70 < m_{jj} < 105 \text{ GeV}$ for $Z \rightarrow jj$		
		$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)		$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.35$ (VBF)



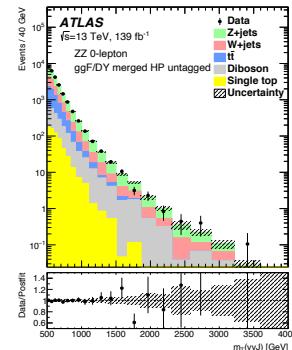
(a) VBF, merged HP



(b) VBF, merged LP



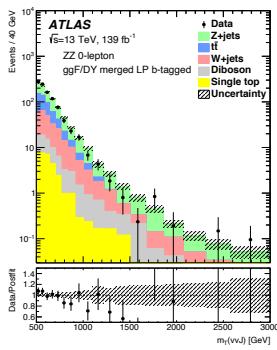
(c) ggF/DY, merged HP tagged



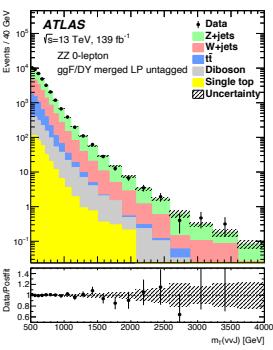
(d) ggF/DY, merged HP untagged

## 0-lep invariant mass

Paper: <https://arxiv.org/abs/2004.14636>



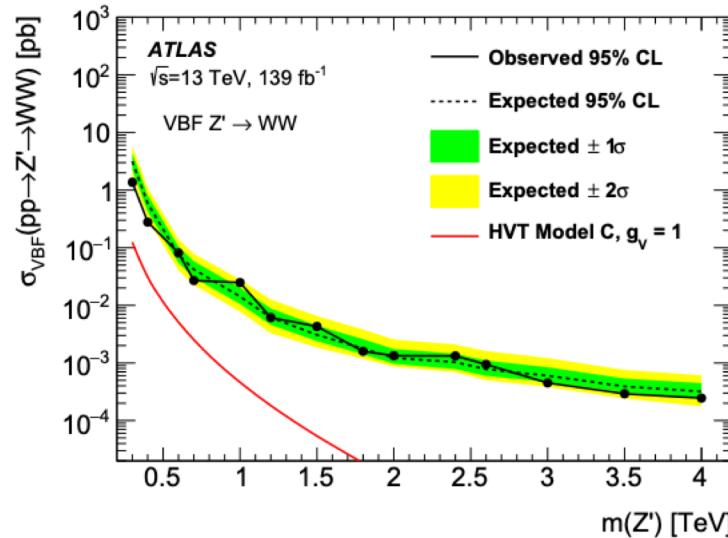
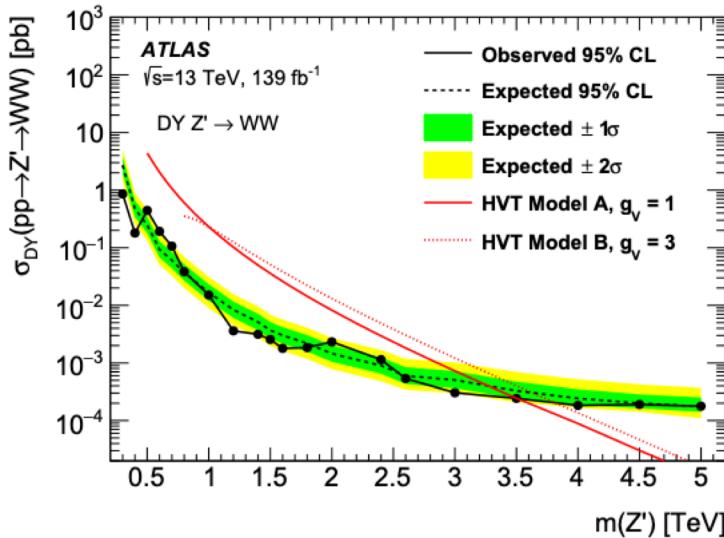
(e) ggF/DY, merged LP tagged



(f) ggF/DY, merged LP untagged



Paper: <https://arxiv.org/abs/2004.14636>



- Observed (black solid curve) and expected (black dashed curve) 95% CL upper limits on the (a) DY and (b) VBF production cross-section of an HVT  $Z'$  boson at  $\sqrt{s} = 13 \text{ TeV}$  in the  $WW$  decay mode as functions of its mass, combining searches in the three leptonic channels

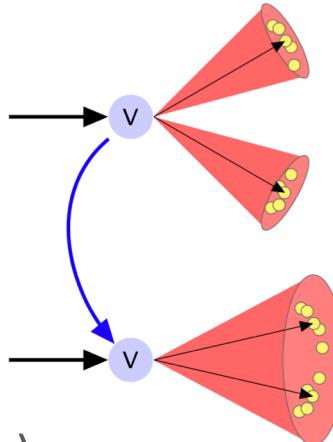


# Significance

- Simplified Significance Equation:  $\sigma = \sum \sigma_i^2$ 
  - Where  $\sigma_i = \frac{s_i}{\sqrt{s_i+b_i}}$  significance per bin; and,  $s_i$  = signal per bin,  $b_i$  = total background per bin
- More standard definition: 
$$Z = \begin{cases} +\sqrt{2 \left( n \ln \left[ \frac{n}{b} \right] - (n - b) \right)} & \text{if } n \geq b \\ -\sqrt{2 \left( n \ln \left[ \frac{n}{b} \right] - (n - b) \right)} & \text{if } n < b. \end{cases}$$
  - <http://cdsweb.cern.ch/record/2736148/files/ATL-PHYS-PUB-2020-025.pdf> (Equation 2)
  - $n$  = number of events,  $b$  = predicted number of events

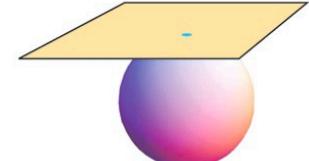
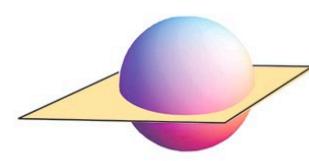
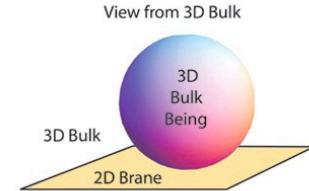
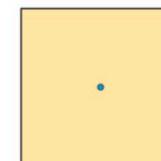
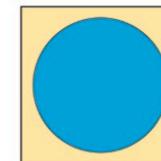
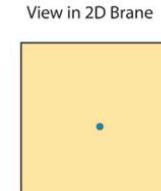
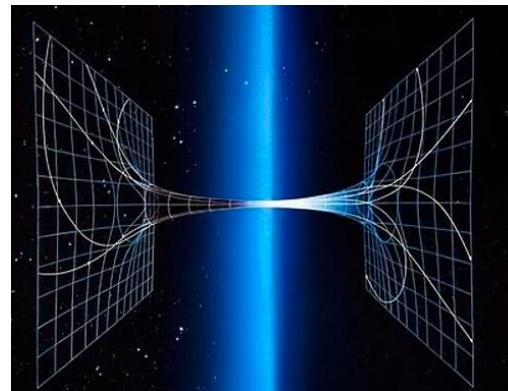
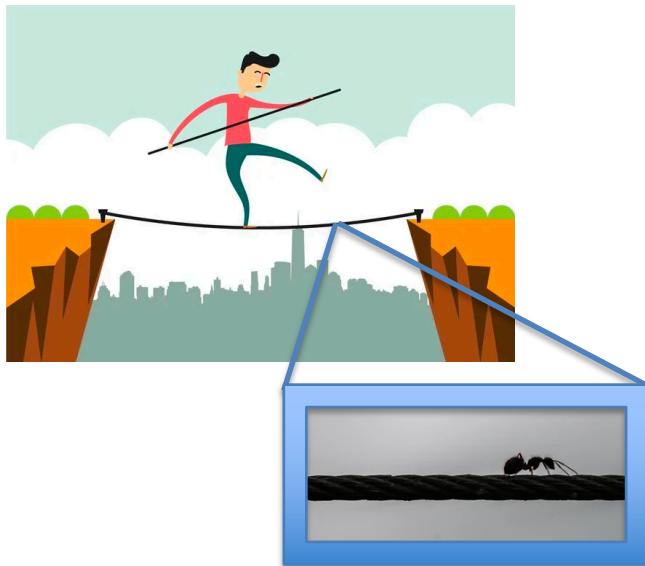
# Definitions

- Resolved
  - Two small R-jets
- Merged
  - One large R-jet
  - Only merged used here
- Jet substructure variable ( $D_2$ )
  - Large R-jet selection
  - Reconstructed by the energy correlation functions
- Missing  $E_T$  (MET or  $E_T^{miss}$ )
  - Reconstructed by negative sum of the all physics objects and ID tracks not associated with them





- Graviton
  - Hypothetical spin-2 particle that mediates the gravitational force





- Pre-selection
  - Very limited cuts to reduce the data size of the CxAOD's
  - Zero reconstructed electrons/muons, some MET threshold, and one large-R jet
- Signal Regions
  - Several stricter cuts than pre-selection, with one of those cuts requiring boson tagging.
  - Try to maximize signal, minimize background
- Control Regions
  - Regions which look very similar to the signal region but have some slightly different selection to enrich a particular background (i.e. V boson), which is orthogonal to the signal region