

Searching for Uncovered and Unexpected New Physics at the Energy Frontier

Julia Gonski

6 February 2023

Panofsky Fellowship Seminar



Outline

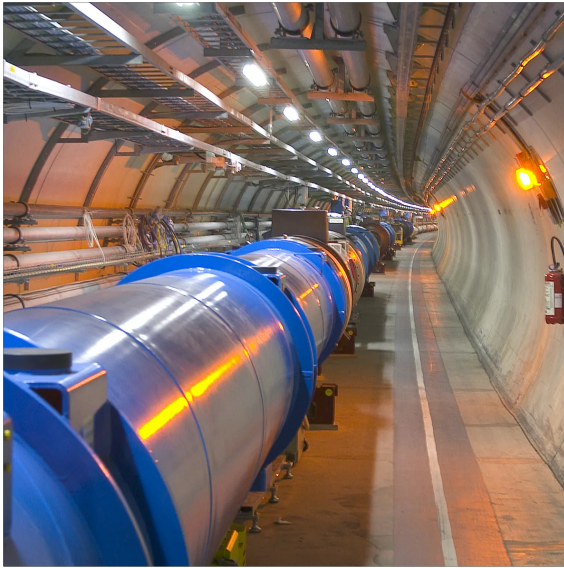
1. **Past:** motivation for new fundamental physics
2. **Present:** novel ATLAS searches
 - Long lived particles
 - Heavy resonances & anomaly detection
3. **Future:** the High Luminosity LHC upgrade & beyond the LHC

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Collider Experiment Strategy

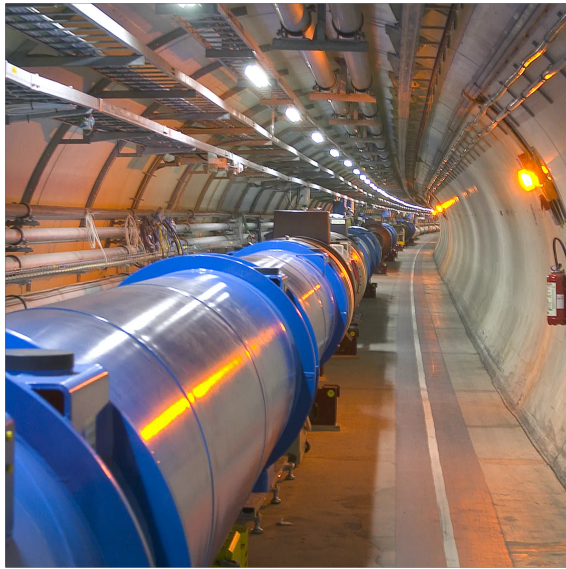
High Energy Accelerator



Collider Experiment Strategy

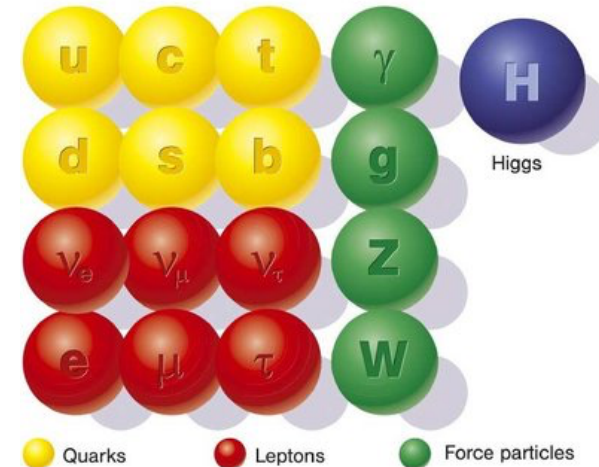


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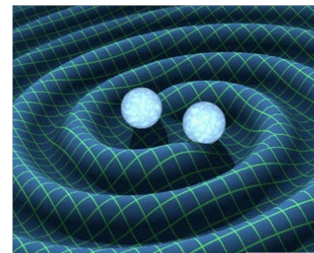


Physics Results

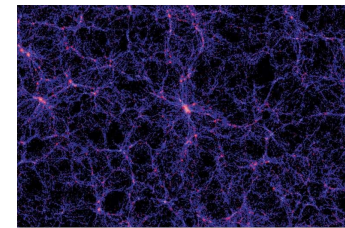
The Standard Model



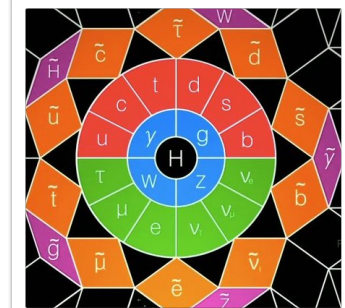
Gravity?



Dark Matter?



Supersymmetry?



Collider Experiment Strategy

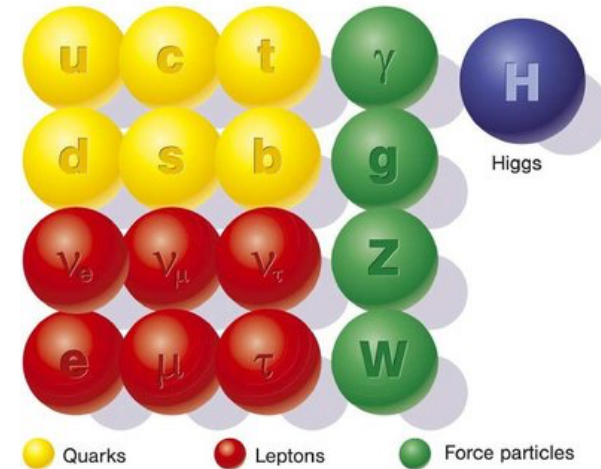


High Energy Accelerator

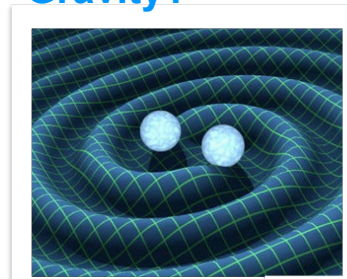


Physics Results

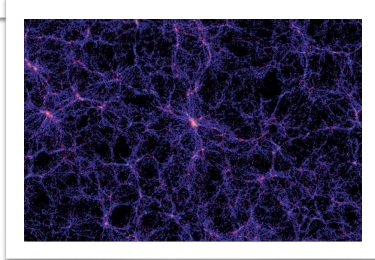
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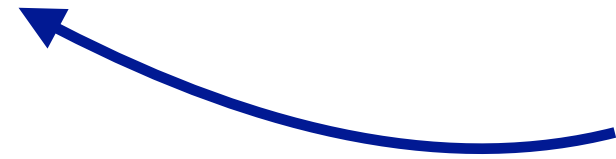
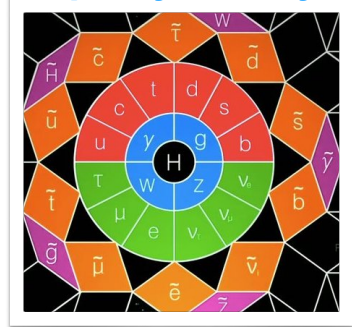
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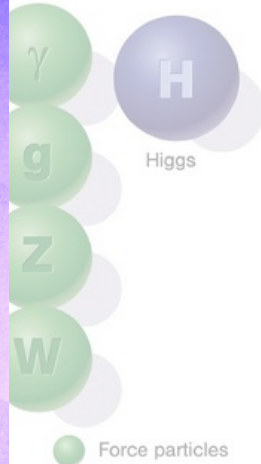
Collider Experiment Strategy

Maximize chances to discover new physics!

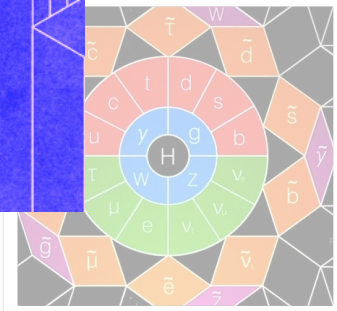
High Energy

Results

Standard Model



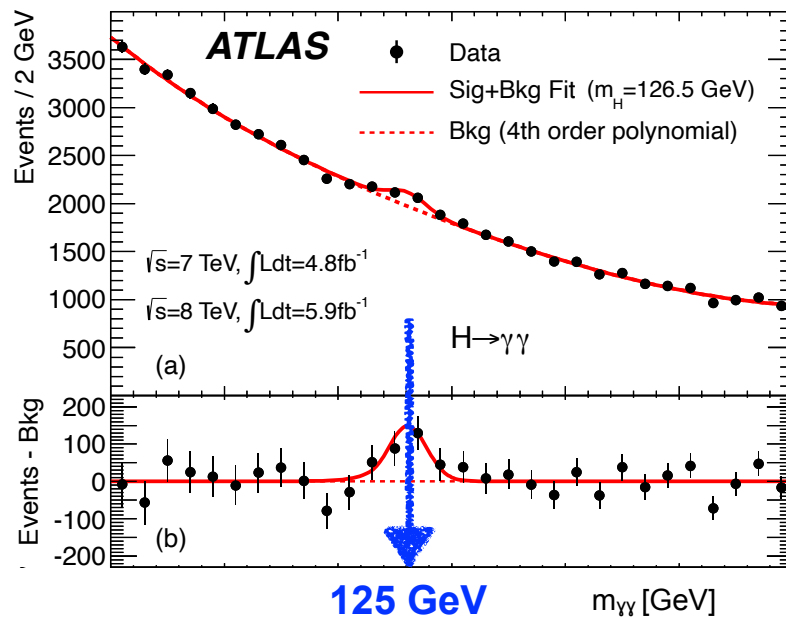
Symmetry?



The Higgs Boson

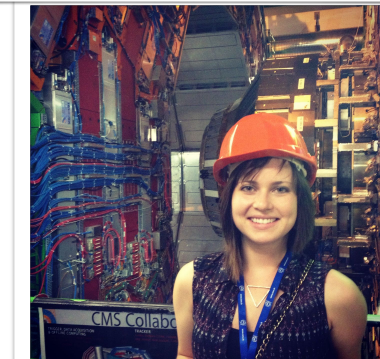
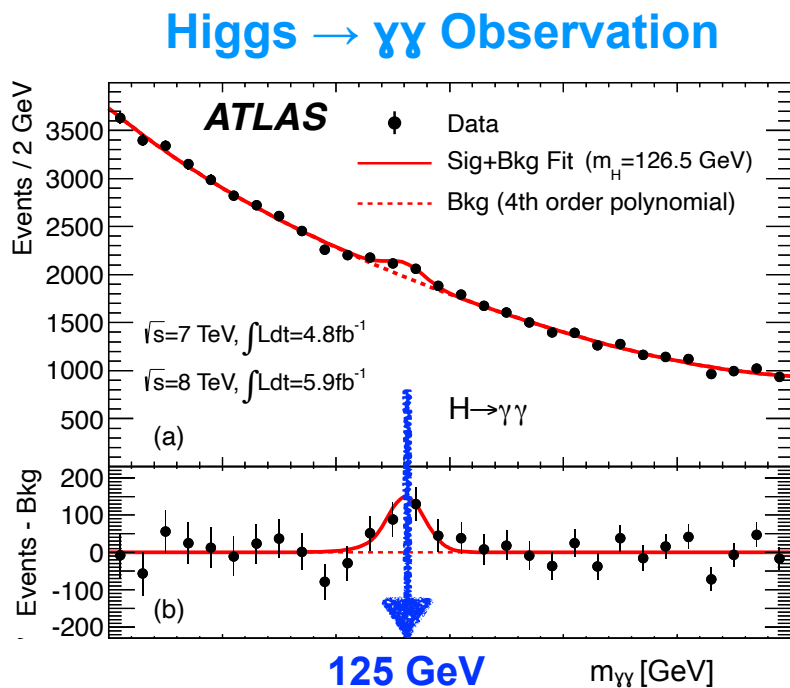
- Higgs boson discovery at the Large Hadron Collider in 2012 “completes” the Standard Model
 - Least precision measurements on its mass, couplings, branching ratios...
 - Emphasizes **TeV mass scale** for new physics: mitigate fine tuning in Standard Model, Higgs coupling to particle mass

Higgs $\rightarrow \gamma\gamma$ Observation



The Higgs Boson

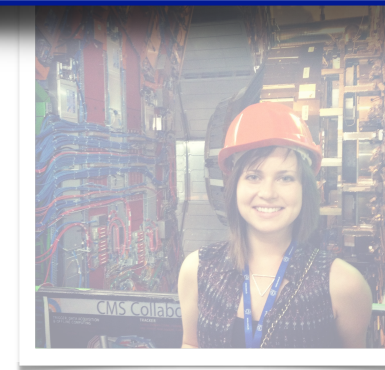
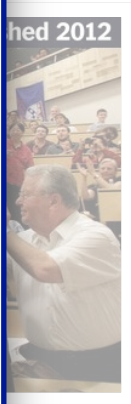
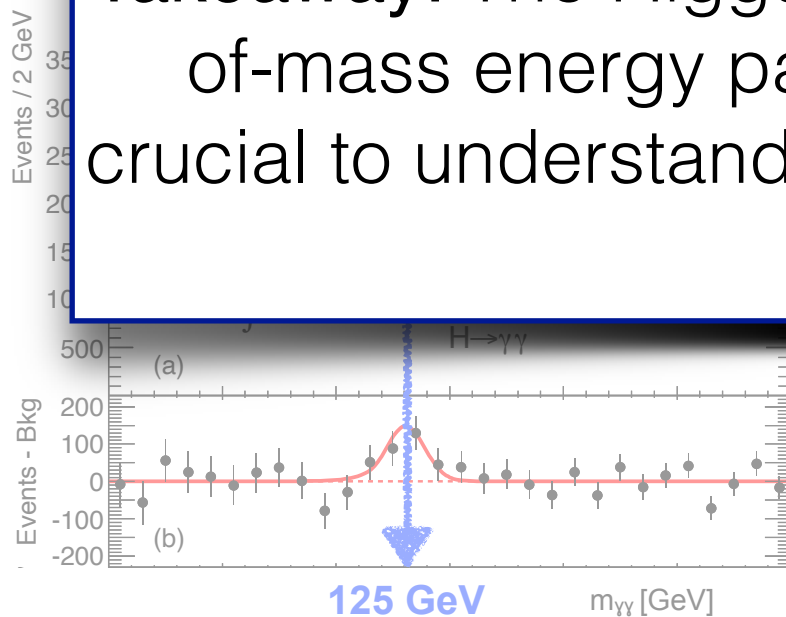
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The Higgs Boson

- Higgs boson discovery at the Large Hadron Collider in 2012 “completes” the Standard Model
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Takeaway: The Higgs boson & high center-of-mass energy particle collisions are crucial to understand fundamental universe



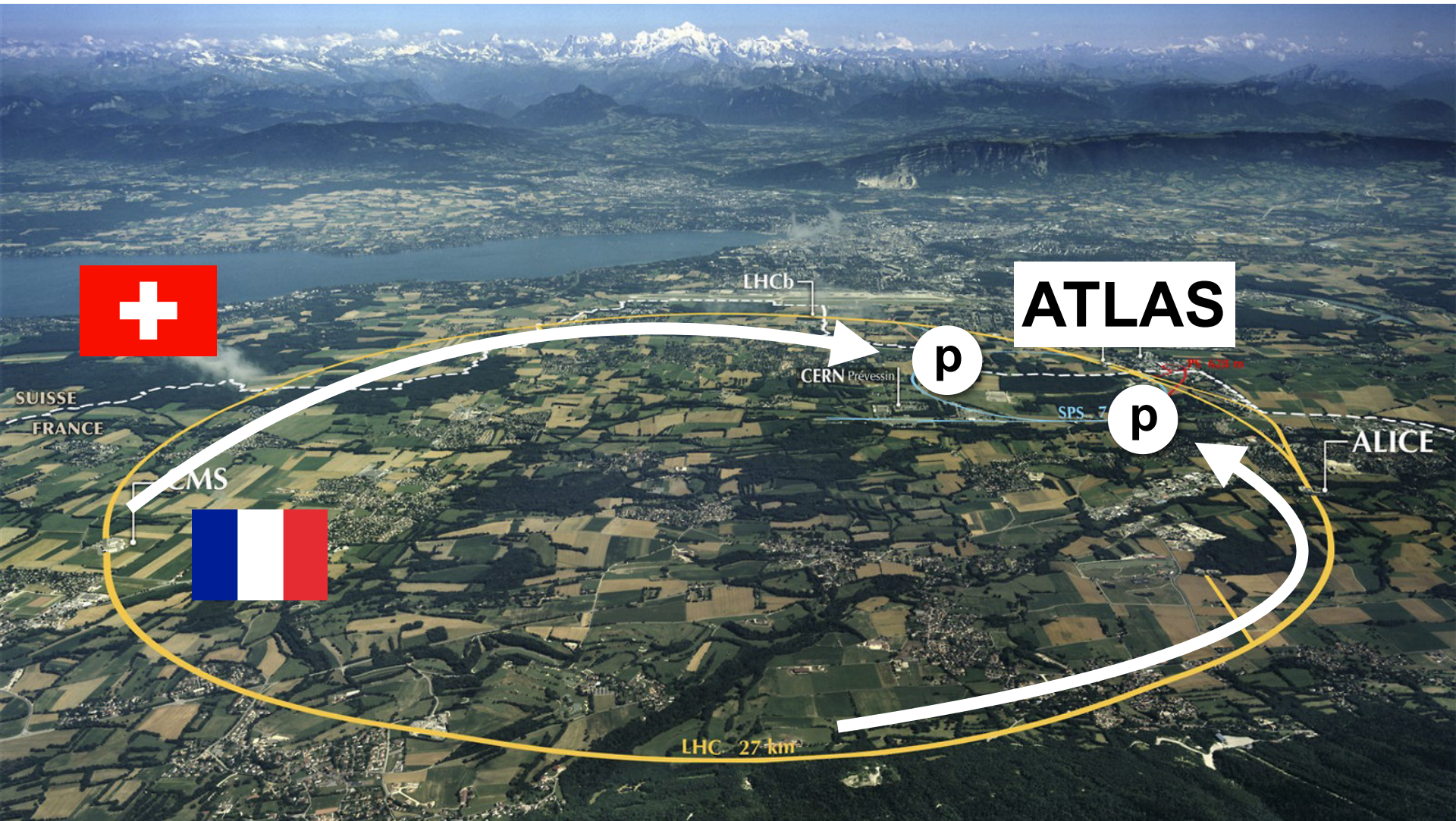
The Large Hadron Collider

- 27 km synchrotron at CERN colliding protons at $\sqrt{s} = 13$ TeV



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The ATLAS Detector



The ATLAS Detector



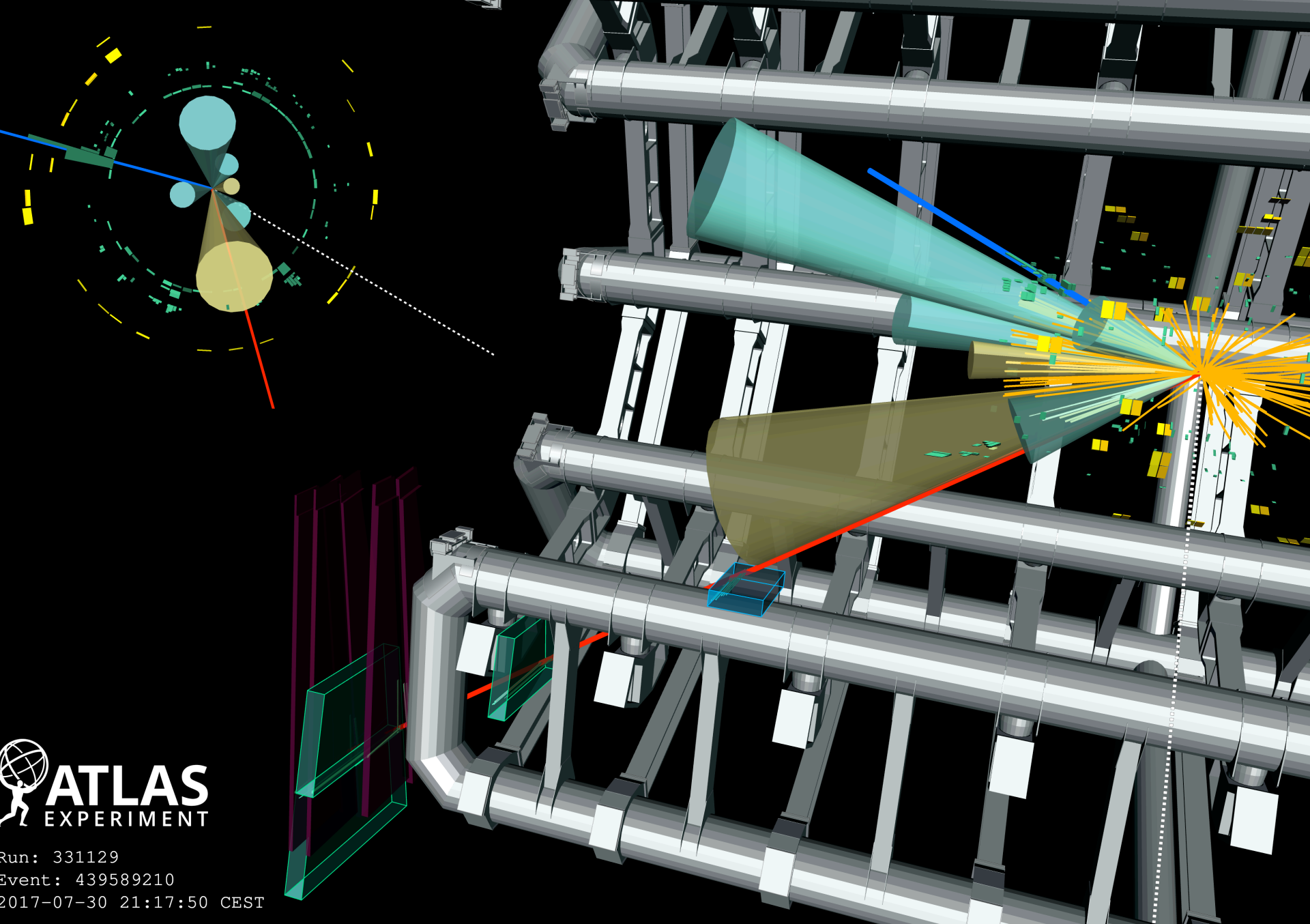
Pixel inner detector

SLAC NATIONAL
ACCELERATOR
LABORATORY

Liquid argon (LAr)
electromagnetic
calorimeter

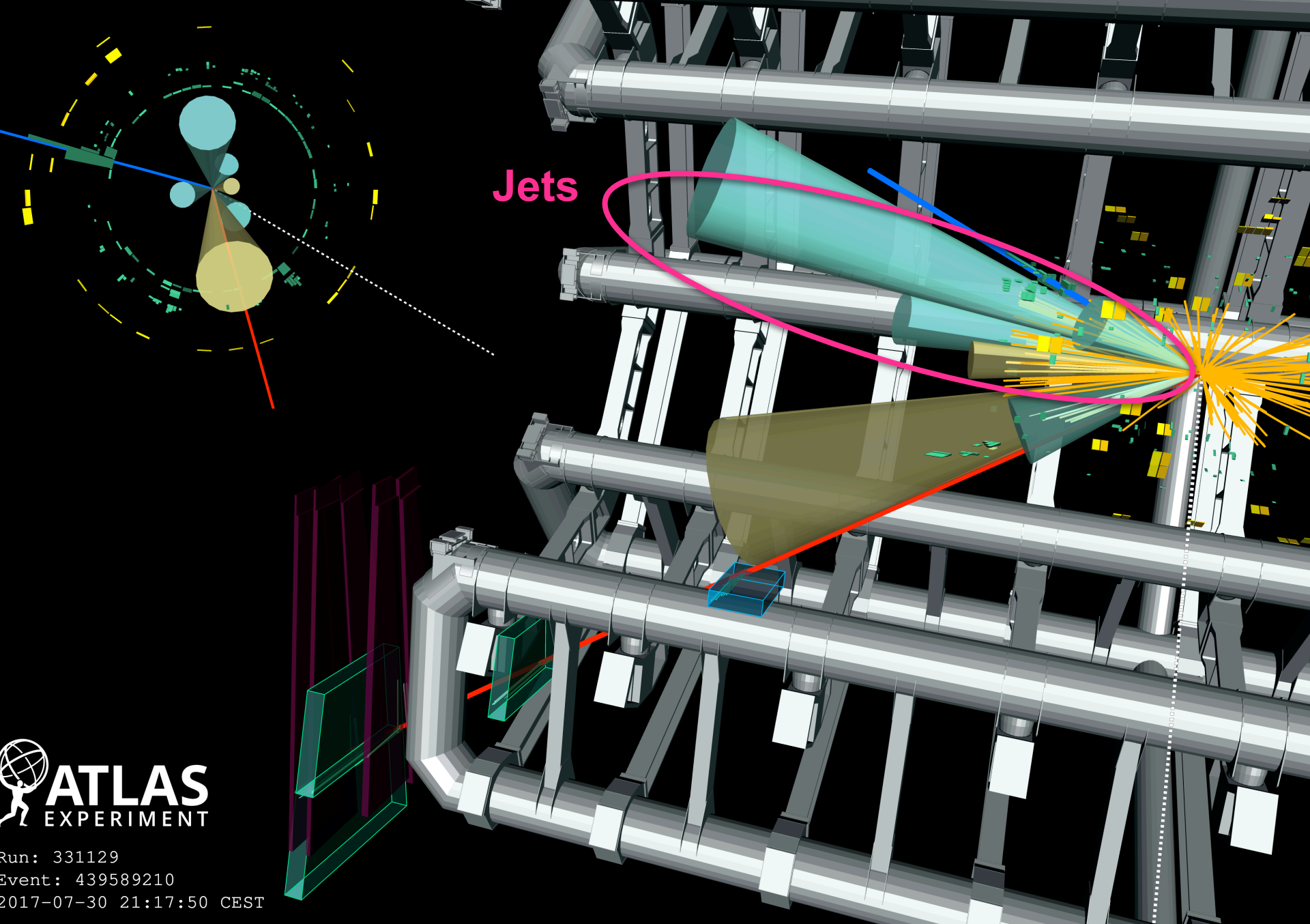
COLUMBIA
UNIVERSITY





 **ATLAS**
EXPERIMENT

Run: 331129
Event: 439589210
2017-07-30 21:17:50 CEST



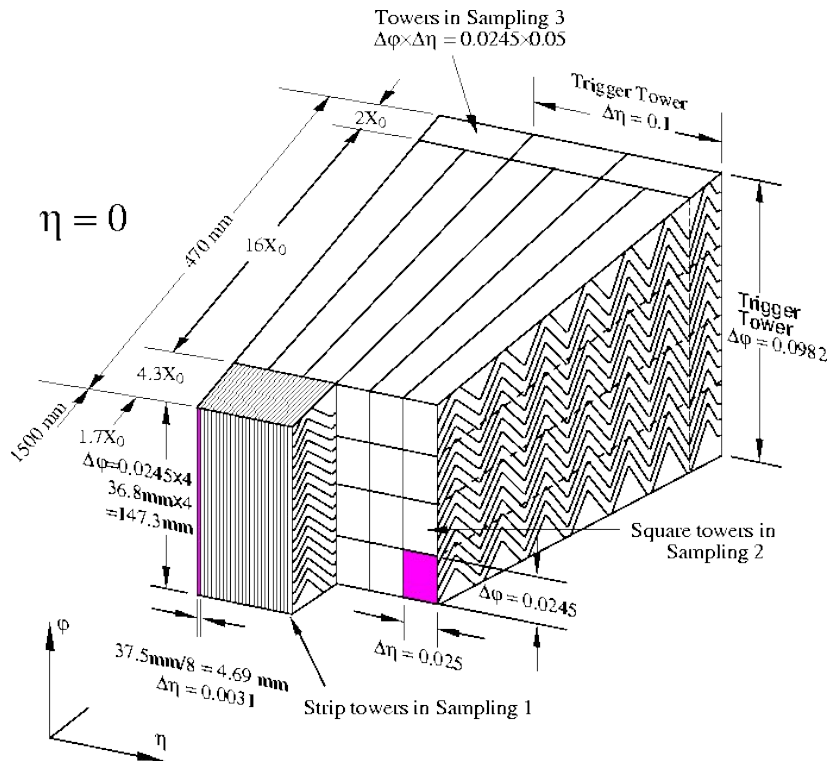
Jets

 **ATLAS**
EXPERIMENT

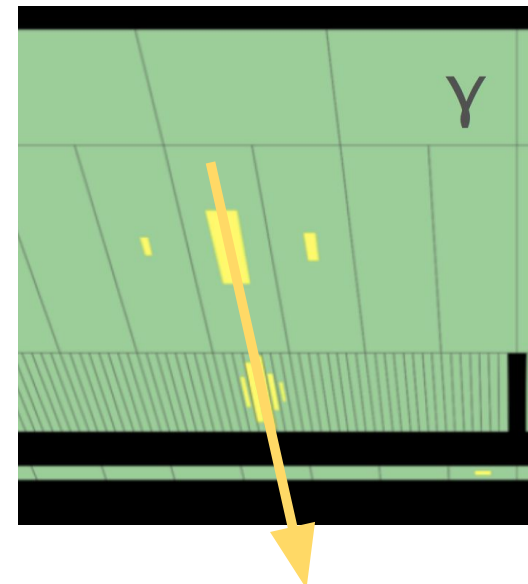
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ATLAS LAr EM Calorimeter

- Sampling calorimeter with accordion geometry of active (LAr) and absorber (lead); three layers in barrel
 - Key measurements of Higgs $\rightarrow \Upsilon\Upsilon$ discovery channel
- Readout electronics system samples calorimeter cells at LHC frequency of 40 MHz and sends a digitized pulse off the detector



Photon in LAr Calo



Where To Look For New Physics?

~TeV scale exclusions across many final states?

ATLAS SUSY Searches* - 95% CL Lower Limits ATLAS Preliminary
√s = 13 TeV

Model	Signature	$\int \mathcal{L} dt$ [fb $^{-1}$]	Mass limit	Reference		
Inclusive Searches	$q\bar{q}, \tilde{q} \rightarrow q\tilde{\chi}_1^0$	0 e, μ mono-jet	E_T^{miss} 139 E_T^{miss} 36.1	\tilde{q} [x, 6x Degen] 1.0 \tilde{q} [8x Degen] 0.9	$m(\tilde{\chi}_1^0) < 400$ GeV $m(\tilde{q}) - m(\tilde{\chi}_1^0) = 5$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}\tilde{\chi}_1^0$	0 e, μ 2-6 jets	E_T^{miss} 139	\tilde{g} 2.3 Forbidden 1.15-1.95	$m(\tilde{\chi}_1^0) = 0$ GeV $m(\tilde{g}) = 1000$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}W\tilde{\chi}_1^0$	1 e, μ 2-6 jets	E_T^{miss} 139	\tilde{g} 2.2	$m(\tilde{\chi}_1^0) < 600$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}(t\ell)\tilde{\chi}_1^0$	$ee, \mu\mu$ 2 jets	E_T^{miss} 36.1	\tilde{g} 1.2	$m(\tilde{g}) - m(\tilde{\chi}_1^0) = 50$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}WZ\tilde{\chi}_1^0$	0 e, μ 7-11 jets	E_T^{miss} 139	\tilde{g} 1.97	$m(\tilde{\chi}_1^0) < 600$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}WZ\tilde{\chi}_1^0$	SS e, μ 6 jets	E_T^{miss} 139	\tilde{g} 1.15	$m(\tilde{g}) - m(\tilde{\chi}_1^0) = 200$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow t\tilde{\chi}_1^0$	0-1 e, μ SS e, μ 6 jets	E_T^{miss} 139	\tilde{g} 2.25 \tilde{g} 1.25	$m(\tilde{\chi}_1^0) < 200$ GeV $m(\tilde{g}) - m(\tilde{\chi}_1^0) = 300$ GeV	
3 rd gen. squarks direct production	$\tilde{b}_1\tilde{b}_1$	0 e, μ 2 b	E_T^{miss} 139	\tilde{b}_1 1.255 \tilde{b}_1 0.68	$m(\tilde{\chi}_1^0) < 400$ GeV 10 GeV $< \Delta m(\tilde{b}_1, \tilde{\chi}_1^0) < 20$ GeV	
	$\tilde{b}_1\tilde{b}_1, \tilde{b}_1 \rightarrow b\tilde{\chi}_2^0 \rightarrow b h\tilde{\chi}_1^0$	0 e, μ 2 b	E_T^{miss} 139 E_T^{miss} 139	Forbidden \tilde{b}_1 0.23-1.35	$\Delta m(\tilde{\chi}_2^0, \tilde{\chi}_1^0) = 130$ GeV, $m(\tilde{\chi}_1^0) = 100$ GeV $\Delta m(\tilde{\chi}_2^0, \tilde{\chi}_1^0) = 130$ GeV, $m(\tilde{\chi}_1^0) = 0$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow t\tilde{\chi}_1^0$	0-1 e, μ ≥ 1 jet	E_T^{miss} 139	\tilde{t}_1 1.25	$m(\tilde{\chi}_1^0) = 1$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow Wb\tilde{\chi}_1^0$	1 e, μ 3 jets/1 b	E_T^{miss} 139	Forbidden 0.65	$m(\tilde{\chi}_1^0) = 500$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow \tilde{\tau}_1 b\tilde{\nu}, \tilde{\tau}_1 \rightarrow \tau\tilde{G}$	1-2 τ 2 jets/1 b	E_T^{miss} 139	Forbidden 1.4	$m(\tilde{\tau}_1) = 800$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow c\tilde{\chi}_1^0 / \tilde{c}\tilde{c}, \tilde{c} \rightarrow c\tilde{\chi}_1^0$	0 e, μ 2 c mono-jet	E_T^{miss} 36.1 E_T^{miss} 139	\tilde{t}_1 0.85	$m(\tilde{\chi}_1^0) = 0$ GeV $m(\tilde{c}) - m(\tilde{\chi}_1^0) = 5$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow t\tilde{\chi}_2^0, \tilde{\chi}_2^0 \rightarrow Z/h\tilde{\chi}_1^0$	1-2 e, μ 1-4 b	E_T^{miss} 139	\tilde{t}_1 0.067-1.18	$m(\tilde{\chi}_2^0) = 500$ GeV	
	$\tilde{t}_2\tilde{t}_2, \tilde{t}_2 \rightarrow \tilde{t}_1 + Z$	3 e, μ 1 b	E_T^{miss} 139	Forbidden 0.86	$m(\tilde{\chi}_1^0) = 360$ GeV, $m(\tilde{t}_1) - m(\tilde{\chi}_1^0) = 40$ GeV	
	EW direct	$\tilde{\chi}_1^{\pm}\tilde{\chi}_2^0$ via WZ	Multiple ℓ /jets $ee, \mu\mu$	E_T^{miss} 139 E_T^{miss} 139	$\tilde{\chi}_1^{\pm}\tilde{\chi}_2^0$ 0.96 $\tilde{\chi}_1^{\pm}\tilde{\chi}_2^0$ 0.205	$m(\tilde{\chi}_1^0) = 0$, wino-bino $m(\tilde{\chi}_1^{\pm}) - m(\tilde{\chi}_2^0) = 5$ GeV, wino-bino
		$\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}$ via WW	2 e, μ	E_T^{miss} 139	$\tilde{\chi}_1^{\pm}$ 0.42	$m(\tilde{\chi}_1^0) = 0$, wino-bino
$\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}$ via Wh		Multiple ℓ /jets	E_T^{miss} 139	Forbidden 1.06	$m(\tilde{\chi}_1^0) = 70$ GeV, wino-bino	
$\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}$ via $\tilde{t}_1/\tilde{\nu}$		2 e, μ 2 τ	E_T^{miss} 139 E_T^{miss} 139	$\tilde{\chi}_1^{\pm}$ 1.0	$m(\tilde{t}_1) = 0.5(m(\tilde{\chi}_1^0) + m(\tilde{\chi}_1^0))$	
$\tilde{\tau}_1\tilde{\tau}_1, \tilde{\tau}_1 \rightarrow \tilde{\chi}_1^0$		2 e, μ ≥ 1 jet	E_T^{miss} 139 E_T^{miss} 139	$\tilde{\tau}_1$ [T _L , T _R] 0.7 0.256	$m(\tilde{\chi}_1^0) = 0$ $m(\tilde{\tau}_1) = 0$	
$\tilde{L}_R\tilde{L}_R, \tilde{L} \rightarrow \tilde{\chi}_1^0$		2 e, μ ≥ 1 jet	E_T^{miss} 139 E_T^{miss} 139	\tilde{L} 0.7	$m(\tilde{\chi}_1^0) = 0$ $m(\tilde{L}) - m(\tilde{\chi}_1^0) = 10$ GeV	
$\tilde{H}\tilde{H}, \tilde{H} \rightarrow h\tilde{G}/Z\tilde{G}$		0 e, μ ≥ 3 b 0 jets 0 e, μ ≥ 2 large jets	E_T^{miss} 36.1 E_T^{miss} 139 E_T^{miss} 139	\tilde{H} 0.13-0.23 \tilde{H} 0.55 \tilde{H} 0.29-0.88 \tilde{H} 0.45-0.93	$BR(\tilde{H} \rightarrow h\tilde{G}) = 1$ $BR(\tilde{H} \rightarrow Z\tilde{G}) = 1$ $BR(\tilde{H} \rightarrow Z\tilde{G}) = 1$	
Long-lived particles		Direct $\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}$ prod., long-lived $\tilde{\chi}_1^{\pm}$	Disapp. trk 1 jet	E_T^{miss} 139	$\tilde{\chi}_1^{\pm}$ 0.66 $\tilde{\chi}_1^{\pm}$ 0.21	Pure Wino Pure Higgsino
		Stable \tilde{g} R-hadron	Multiple	36.1	\tilde{g} 2.0	$m(\tilde{\chi}_1^0) = 100$ GeV
		Metastable \tilde{g} R-hadron, $\tilde{g} \rightarrow q\tilde{q}\tilde{\chi}_1^0$	Multiple	36.1	\tilde{g} [τ(ḡ) = 10 ns, 0.2 ns] 2.05 2.4	$m(\tilde{\chi}_1^0) = 100$ GeV
RPV	$\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}/\tilde{\chi}_1^0, \tilde{\chi}_1^{\pm} \rightarrow Z\ell\ell$	3 e, μ	139	$\tilde{\chi}_1^{\pm}$ [BR(Zτ)=1, BR(Ze)=1] 1.05 $\tilde{\chi}_1^{\pm}$ 0.625	Pure Wino	
	$\tilde{\chi}_1^{\pm}\tilde{\chi}_1^{\mp}/\tilde{\chi}_2^0 \rightarrow WZ\ell\ell\nu\nu$	4 e, μ	E_T^{miss} 139	$\tilde{\chi}_1^{\pm}$ [A ₃₃ ≠ 0, A ₁₂₃ = 0] 1.55 $\tilde{\chi}_1^{\pm}$ 0.95	$m(\tilde{\chi}_1^0) = 200$ GeV	
	$\tilde{g}\tilde{g}, \tilde{g} \rightarrow q\tilde{q}\tilde{\chi}_1^0, \tilde{\chi}_1^0 \rightarrow q\tilde{q}\tilde{\chi}_1^0$	4-5 large jets	36.1	\tilde{g} [m($\tilde{\chi}_1^0$) = 200 GeV, 1100 GeV] 1.3 1.9 \tilde{g} [A ₃₃ = 2e-4, 1e-2] 1.05	Large A'_{12}	
	$\tilde{t}_1, \tilde{t}_1 \rightarrow t\tilde{\chi}_1^0, \tilde{\chi}_1^0 \rightarrow t\tilde{b}\tilde{s}$	Multiple	36.1	Forbidden 0.55	$m(\tilde{\chi}_1^0) = 200$ GeV, bino-like	
	$\tilde{t}_1, \tilde{t}_1 \rightarrow b\tilde{\chi}_1^0, \tilde{\chi}_1^0 \rightarrow b\tilde{b}\tilde{s}$	$\geq 4b$	139	Forbidden 0.95	$m(\tilde{\chi}_1^0) = 500$ GeV	
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow b\tilde{s}$	2 jets + 2 b	36.7	\tilde{t}_1 [qq, bs] 0.42 0.61		
	$\tilde{t}_1\tilde{t}_1, \tilde{t}_1 \rightarrow q\tilde{\ell}$	2 e, μ 2 b DV	36.1 1 μ 136	\tilde{t}_1 [1e-10 < K ₂₁ < 1e-8, 3e-10 < K ₂₂ < 3e-9] 1.0 0.4-1.45	$BR(\tilde{t}_1 \rightarrow b\tilde{c}/b\tilde{d}) > 20\%$ $BR(\tilde{t}_1 \rightarrow u\tilde{d}) = 100\%$, $\cos\theta = 1$	
$\tilde{\chi}_1^0/\tilde{\chi}_2^0/\tilde{\chi}_1^0, \tilde{\chi}_1^0 \rightarrow b\tilde{b}\tilde{s}, \tilde{\chi}_1^0 \rightarrow b\tilde{b}\tilde{s}$	1-2 e, μ ≥ 6 jets	139	$\tilde{\chi}_1^0$ 0.2-0.32	Pure Higgsino		

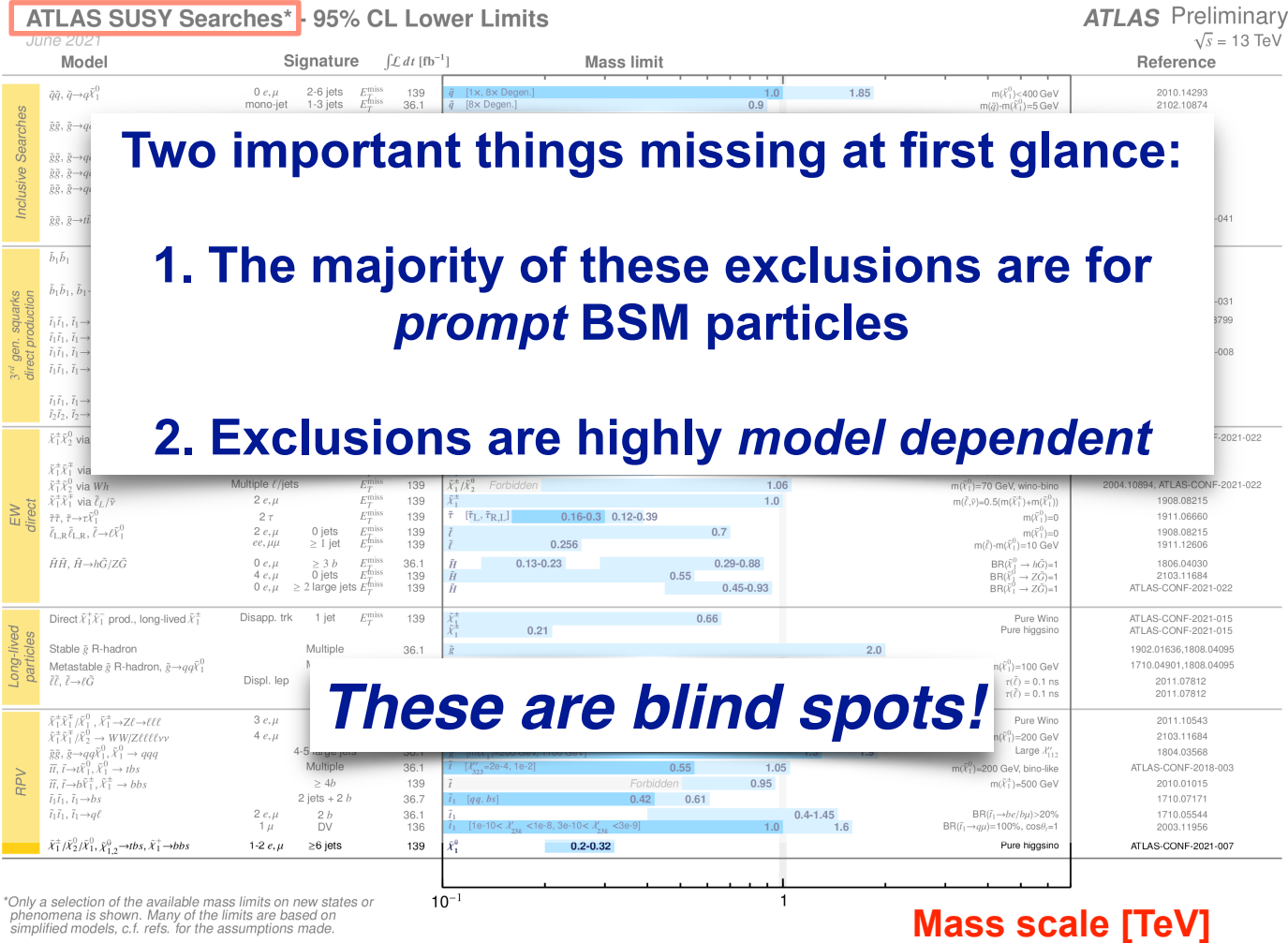
*Only a selection of the available mass limits on new states or phenomena is shown. Many of the limits are based on simplified models, c.f. refs. for the assumptions made.



Mass scale [TeV]

Where To Look For New Physics?

~~~TeV scale exclusions across many final states?~~



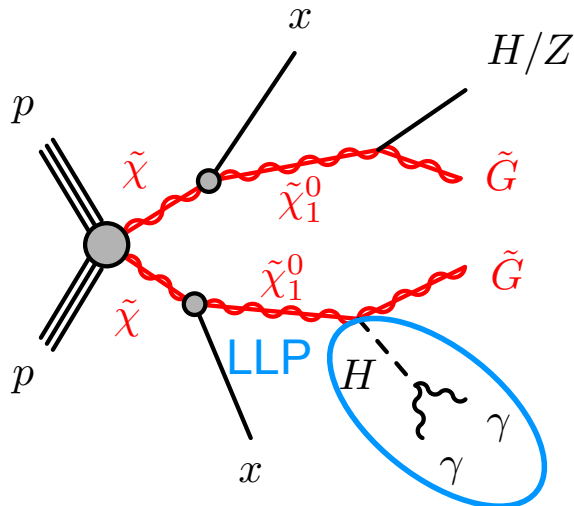
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  - Long lived particles
  - Heavy resonances & anomaly detection
3. **Future:** the High Luminosity LHC upgrade & beyond the LHC

# 1. Long-Lived Particles

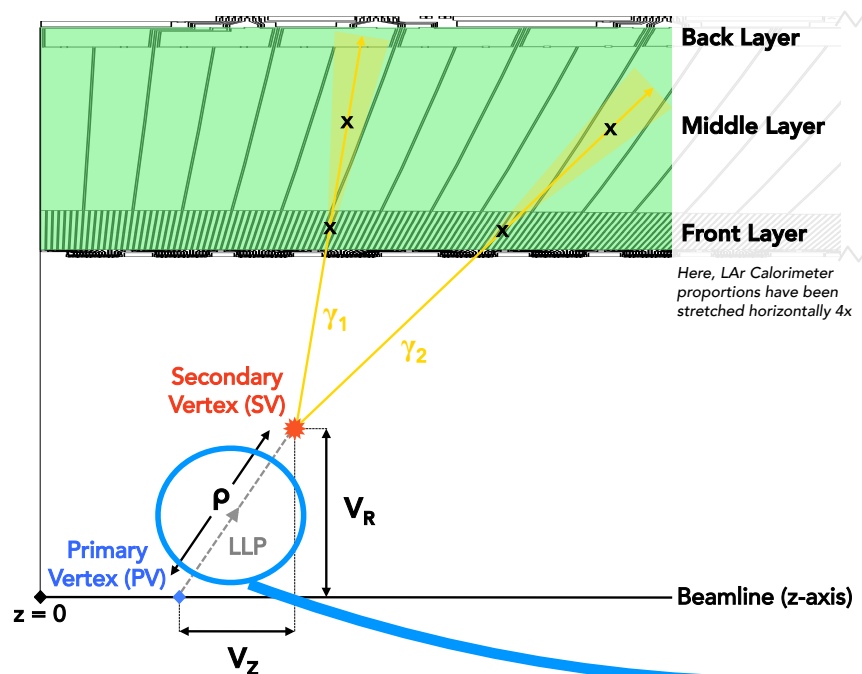
- **Problem:** the majority of collider experimental exclusions pertain to *promptly decaying* new particles
  - Long-lived particles (LLPs) are theoretically well-motivated (eg. small couplings in supersymmetry, dark sectors)
  - But their decays are challenging to reconstruct: create final state objects that are
    - *displaced* (produced off the beam line); and
    - *delayed* (late with respect to bunch crossing)
- ➔ Example: generic new long-lived particles  $\chi$  producing a displaced  $H \rightarrow \gamma\gamma$  decay



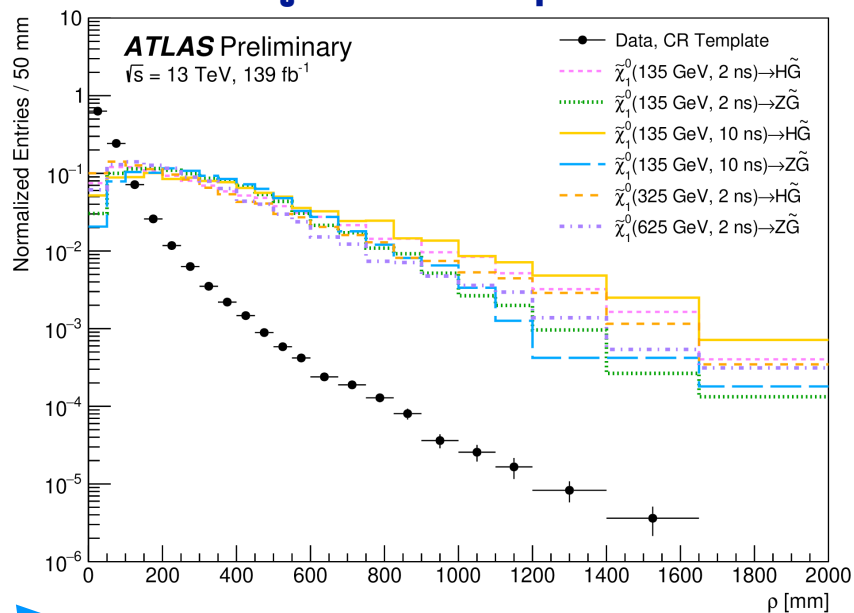
displaced diphotons

# LAr for Delayed Photons

- **Collaboration:** work with **engineers** to ensure the detector and its readout electronics are robust and precise
- **Solution:** creation of new analysis techniques based on precision low-level detector info
  - Timing: ATLAS LAr calorimeter provides timing measurement from ECAL cells with  $\sim 200$  ps resolution
  - Spatial: LAr calo segmented into multiple layers, which allow us to get photon's direction of flight
  - **New !** For sensitivity to displaced di- $e/\gamma$  vertices, combine directional info of 2 paths to localize vertex position in 2D ( $V_r, V_z$ )

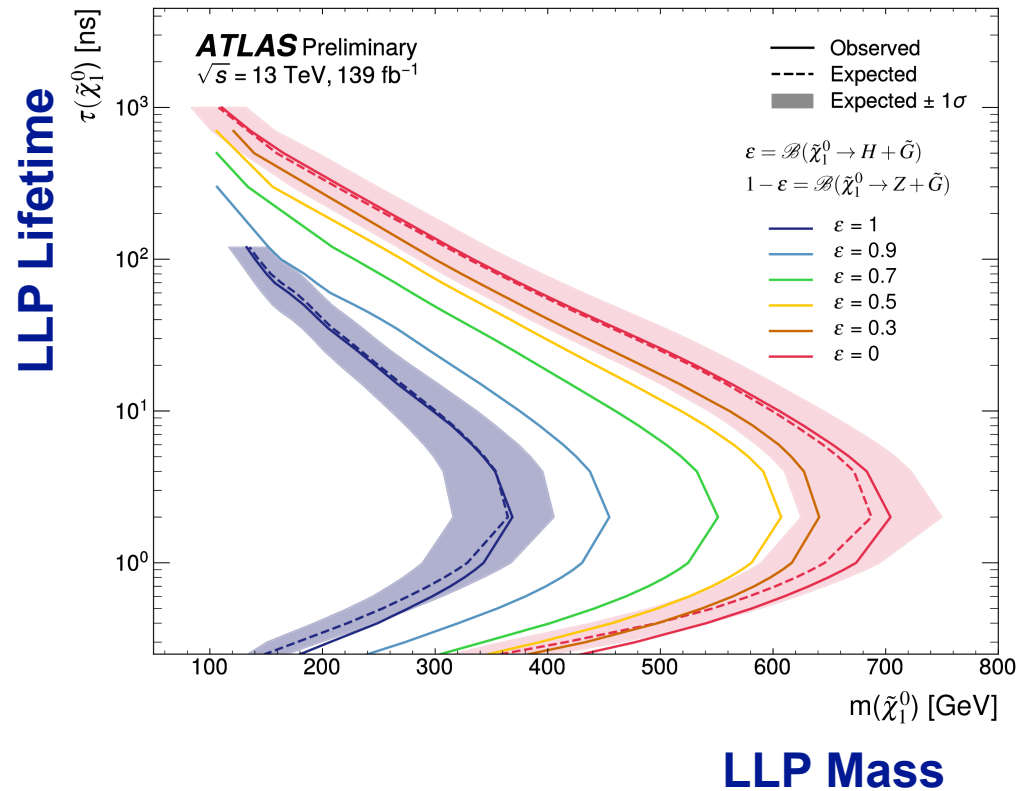


## Di- $e/\gamma$ Vertex Displacement



# Displaced Diphoton Results

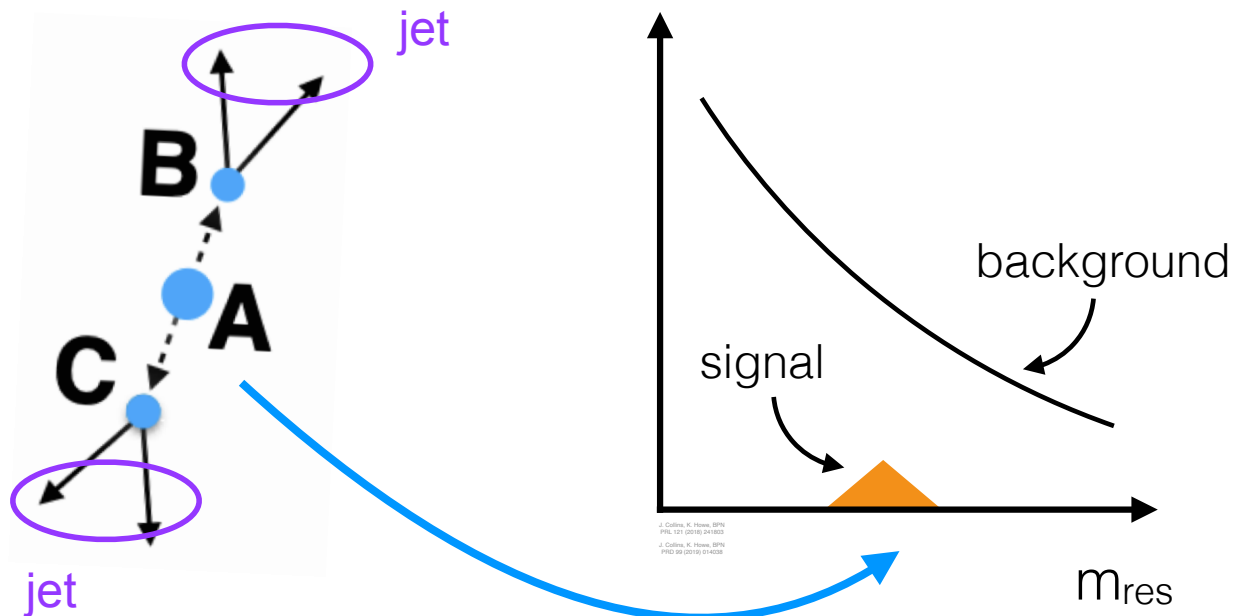
- No significant excess above SM background
  - Sensitive to LLPs with  $\sim 100$ s GeV mass and  $0.1 \text{ ns} < \tau < 1000 \text{ ns}$
- ➔ Takeaway: LLP to  $e/\gamma$  tools validated & primed for use in future searches



[[2209.01029](#),  
[ATLAS-CONF-2022-051](#)]

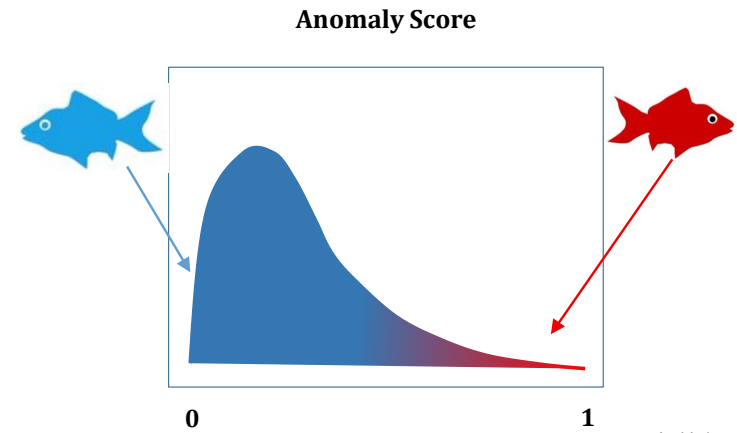
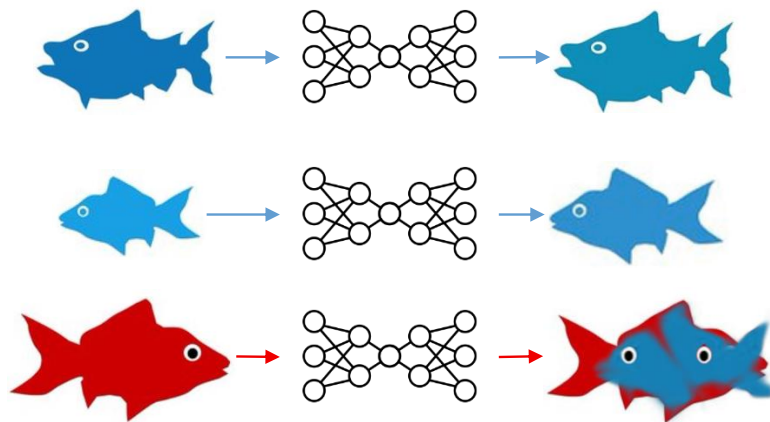
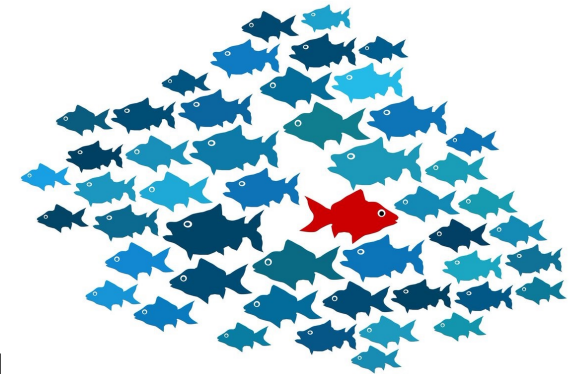
# 2. Heavy Particles

- **Problem:** we need heavy ( $\sim$ TeV scale) new particles & haven't found them
  - TeV-scale new physics motivated by Higgs mass & directly accessible at the LHC
  - High mass A creates high momentum B and C: *boosting* means decay products overlap; reconstruct each daughter as **single large-radius jet with substructure**
  - Highly generic signature: we cannot rely on having a full analysis for every topology



# Machine Learning & Anomaly Detection

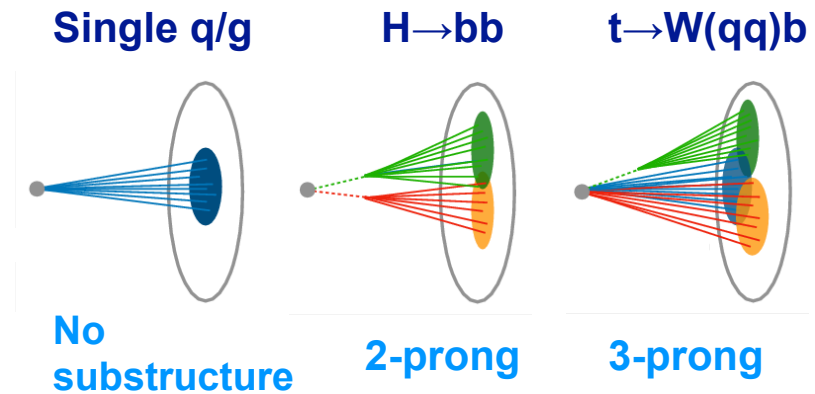
- **Collaboration:** computer/data scientists with sophisticated machine learning algorithms for signal model-independent *anomaly detection*
  - Goal: identify features of the data that are **inconsistent** with a **background-only model**
- **Strategy:** train an ML architecture to reconstruct its input
  - Unsupervised: train over unlabeled events (data)
  - Rarer events with unusual features will be poorly reconstructed  
→ reconstruction accuracy is a good discriminant



A. Kahn

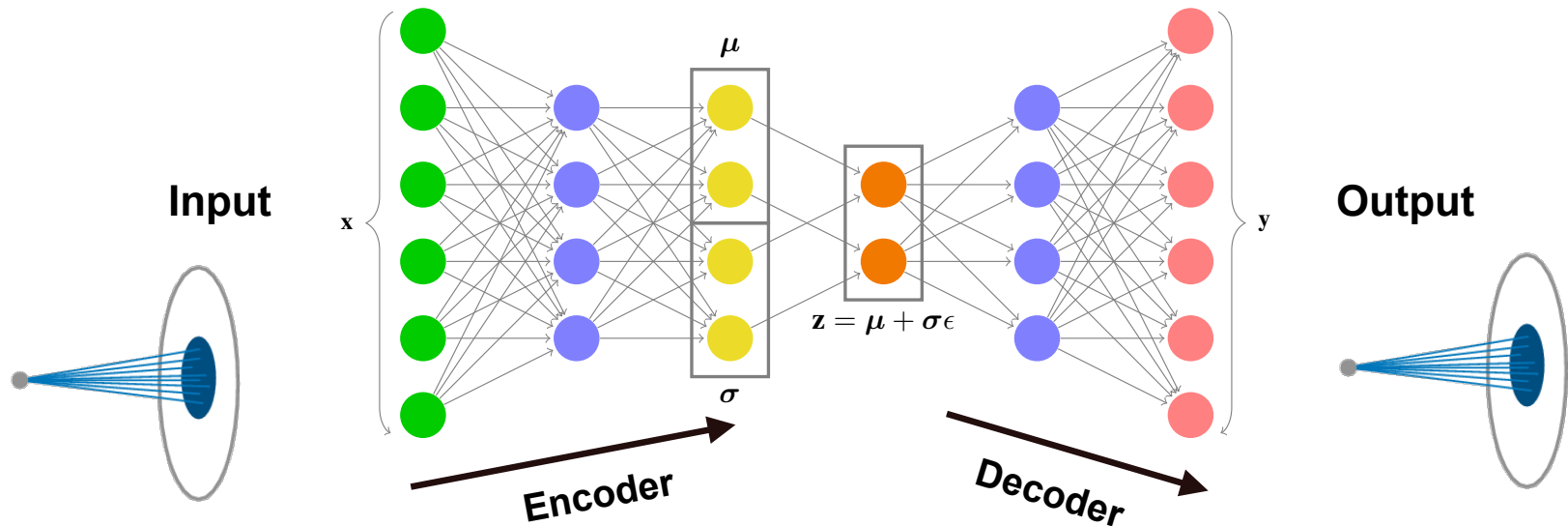
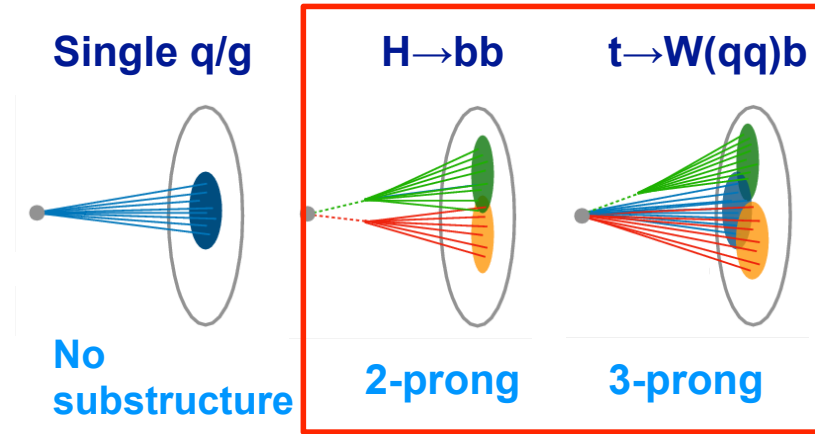
# Autoencoders for Jets

- Input: jets are composed of constituent particles with “prongs” if distinct particles exist within the jet
  - Model jets as a sequence of constituent 4-vectors



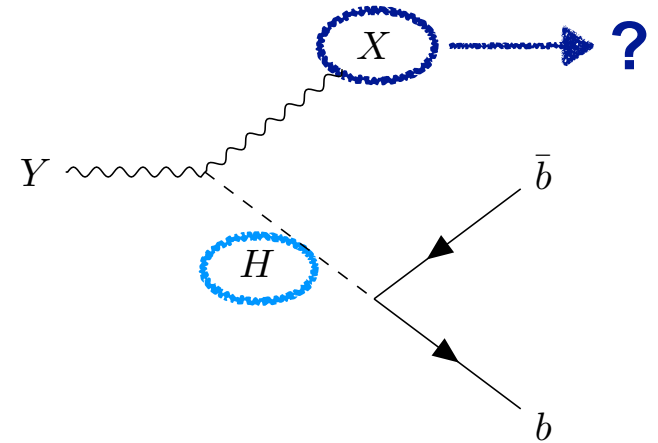
# Autoencoders for Jets

- Input: jets are composed of constituent particles with “prongs” if distinct particles exist within the jet
  - Model jets as a sequence of constituent 4-vectors
- **Autoencoder**: generative model that *encodes* input in lower-dimensional latent space, *decodes* from latent space, and checks reconstruction error
- ➔ **Variational recurrent neural network (VRNN)**: variational autoencoder embedded in recurrent architecture (sequence modeling) to generate *per-jet anomaly score*



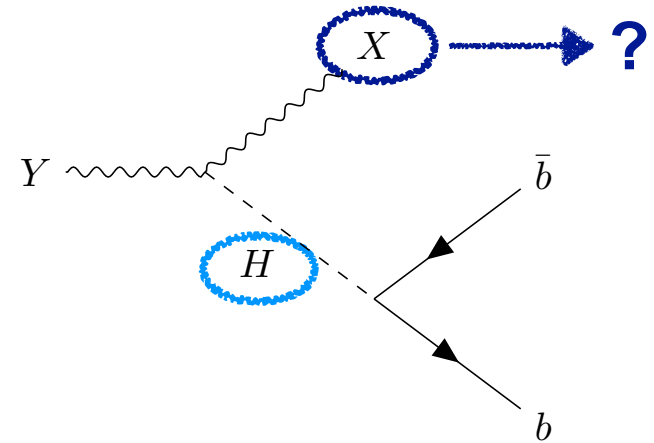
# $Y \rightarrow XH$ Analysis

- **Solution:** ML-based taggers for a generic  $Y \rightarrow XH$  process
  1. Novel **neural net-based** algorithm for tagging boosted  $H \rightarrow b\bar{b}$  topology
  2. **VRNN** trained without labels over full Run 2 dataset of high momentum large-R jets
    - Per-jet anomaly score provides signal-model-independent selection of anomalous X candidate jets

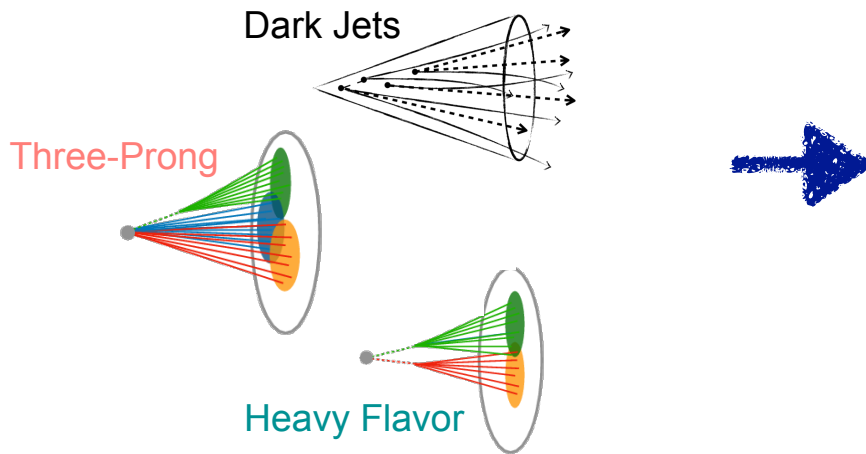


# Y → XH Analysis

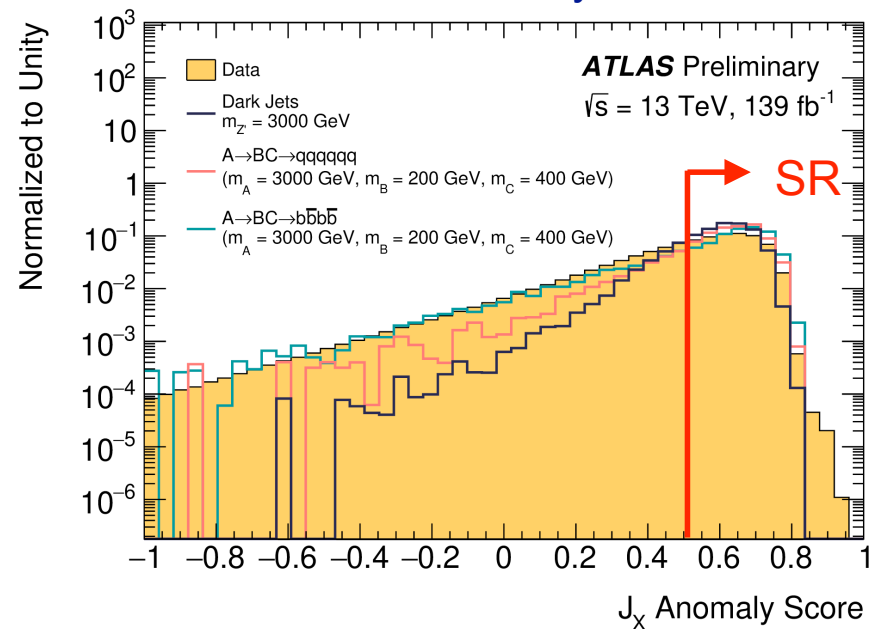
- Solution: ML-based taggers for a generic Y → XH process
  1. Novel **neural net-based** algorithm for tagging boosted H → bb topology
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## Possible Signal Jet Models

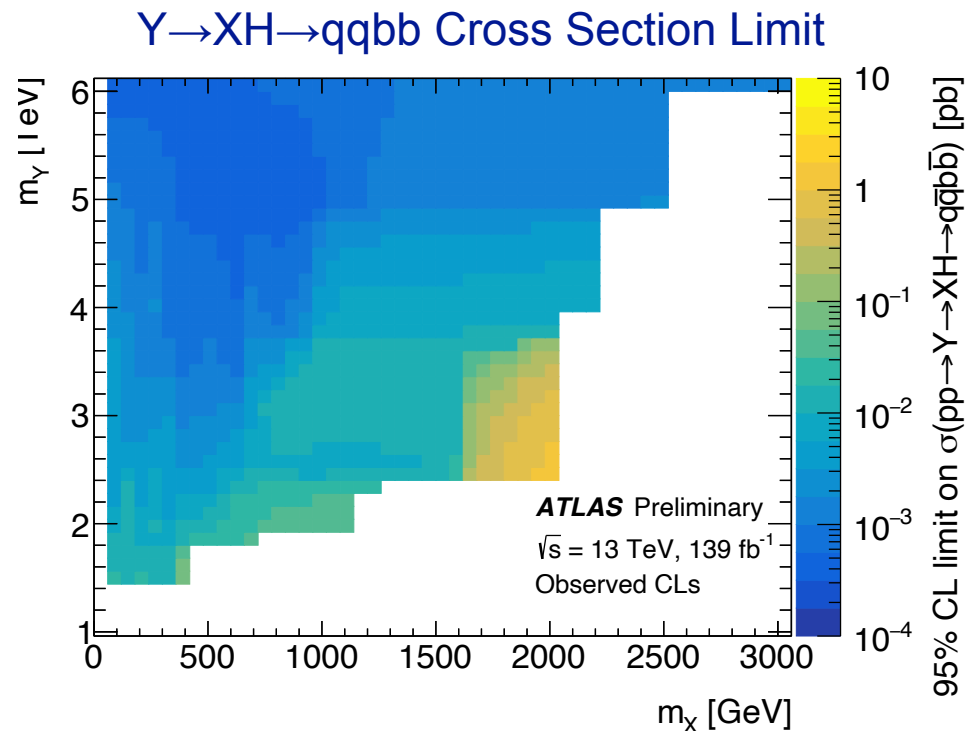


## Jet Anomaly Score



# $Y \rightarrow XH$ Results

- Fit invariant mass of X and H for excesses in overlapping windows of  $m_X$
- No significant excess in data: interpret in nominal  $X \rightarrow qq$ , sensitive up to 6 TeV resonance mass
- ➔ First application of fully unsupervised machine learning to an ATLAS analysis
- ➔ Takeaway: anomaly detection tools & searches are the future!



[[ATLAS-CONF-2022-045](#)]

# Outline

1. **Past:** motivation for new fundamental physics
2. **Present:** novel ATLAS searches
  - Long lived particles
  - Heavy resonances & anomaly detection
3. **Future:** the High Luminosity LHC upgrade & beyond the LHC

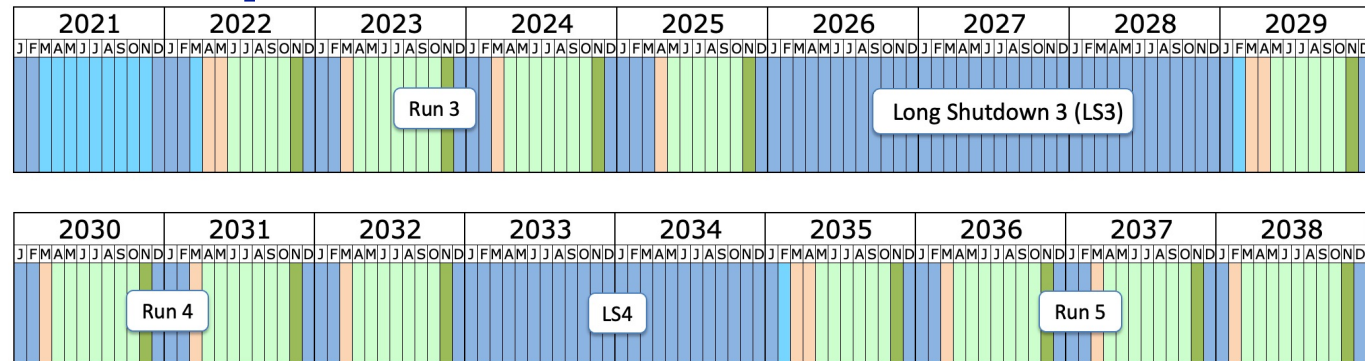
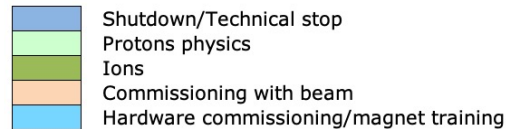
# The Future of the LHC

**2022: Snowmass Community Planning Process**

**2026: Upgrade for High Lumi LHC**

**2029: HL-LHC Data Taking**

Today

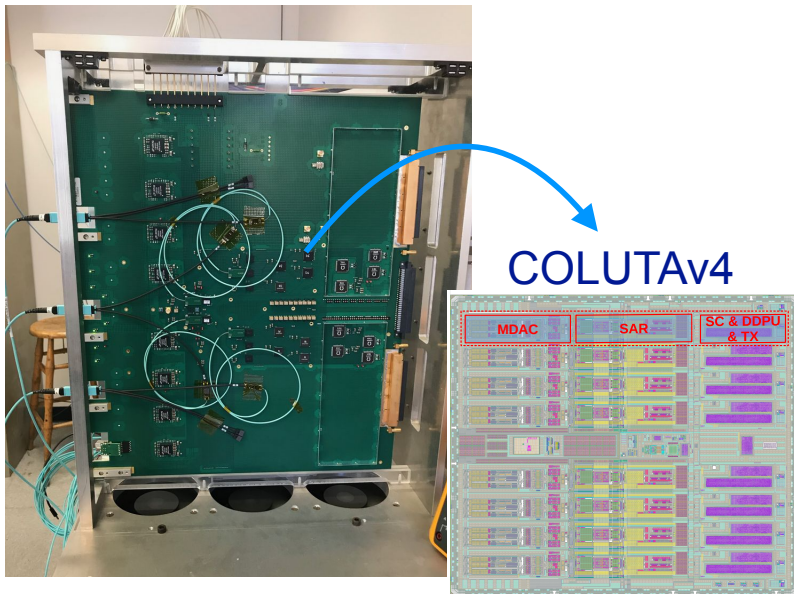


- **High Luminosity LHC (HL-LHC) in ~2029:** up to 200 simultaneous pp collisions to give better handle on very rare new physics processes
  - **ATLAS & CMS detectors:** many subsystems must be upgraded for high occupancy/trigger rates
- ➔ As of now, we've only recorded ~5% of anticipated total lumi!

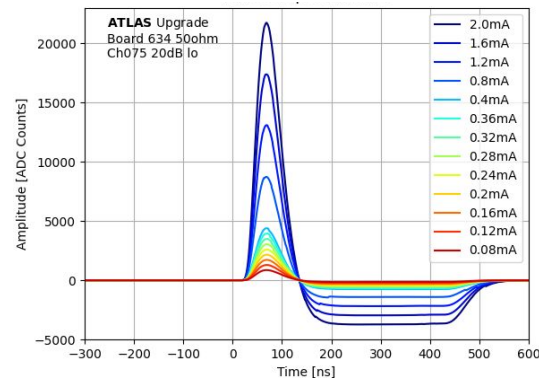
# HL-LHC LAr On-Detector Readout

- LAr calorimeter must function for 10 years of HL-LHC operation ( $\sim 3000\text{-}4000\text{ fb}^{-1}$ )
    - Entirely new electronics system to accommodate higher bandwidth for trigger and radiation tolerance
  - Columbia responsible for the [analog-digital converter \(ADC\) ASIC](#) and the [Front-End Board \(FEB2\)](#)
    - COLUTA ADC: full custom 40 MSPS in 65nm CMOS with 8 channels
    - Slice Testboard = pre-prototype of FEB2 (32 of 128 channels)
    - For large pulses, energy resolution  $< 0.02\%$  (cf. spec  $0.25\%$ ), timing resolution  $\sim 50\text{ ps}$
- ➔ Takeaway: custom ASICs are key for unique HEP DAQ needs; instrumentation experts/engineers are crucial

## Slice Testboard



## LAr Pulses



## COLUTA Radiation Testing



# Future Vision

*Don't lose sight of new scientific discovery as both the ultimate end goal and a real possibility!*

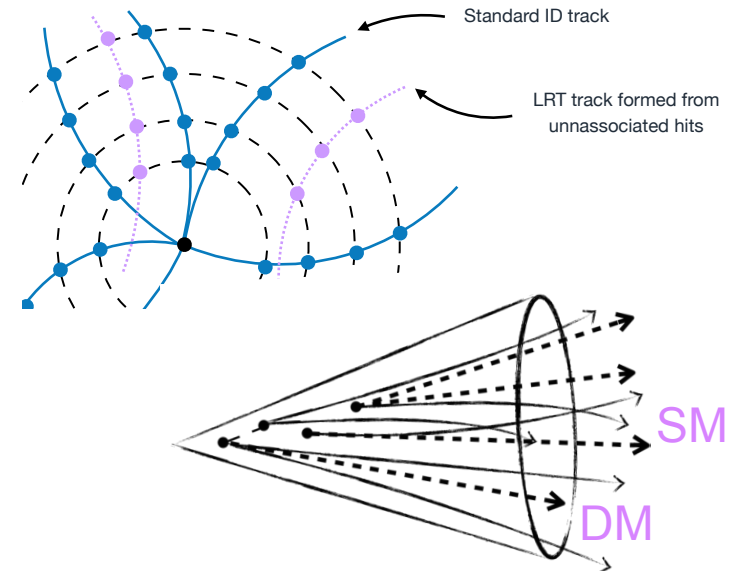


- ◆ How can we best exploit the unique LHC environment while we have it?
- ◆ How can we ensure continued success of particle physics into the far future?
- ◆ How do we foster connections among “data sciences” for long-term mutual benefit?

# Short-Term: Run 3 at the LHC

## 1. Continue searching!

- New LLP triggers: unprecedented sensitivity to novel signatures, eg. via *large-radius tracking*
- Build out end-to-end anomaly detection search pipeline for ATLAS, from data acquisition to final results
  - Ex. generic selection of *dark QCD signatures*
- Keep connecting to the Higgs: expertise within SLAC ATLAS group



## 2. Prepare for Runs 4-5:

- Ensure successful HL-LHC detector upgrade: aim to keep a hand in ATLAS upgrade and operations (collaborating with SLAC silicon ITk responsibilities)
- Shared interest with SLAC on precision timing & Run 5 potential

**SLAC**



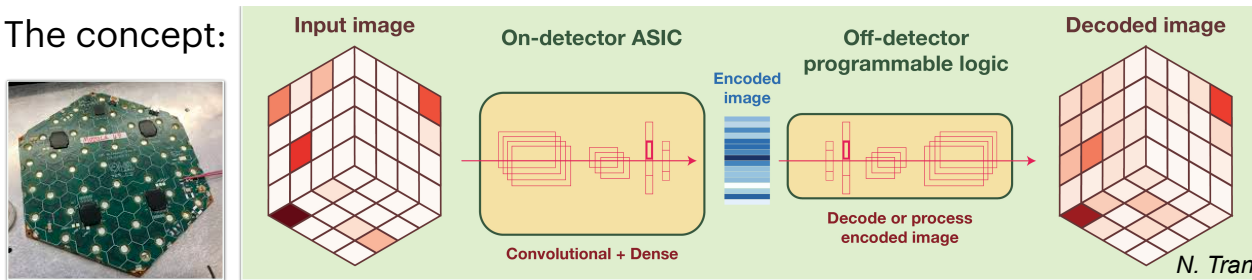
# Mid-Term: Instrumentation Advances

## 1. Fast ML algorithms for real-time scenarios (FPGAs, ASICs)

- Application in ATLAS data acquisition: *anomaly detection trigger stream* could record never-before-seen events and handles to BSM physics
- Many uses beyond HEP: collaborate with other directorates (ex. LCLS-II data acquisition upgrades, TID infrastructure)

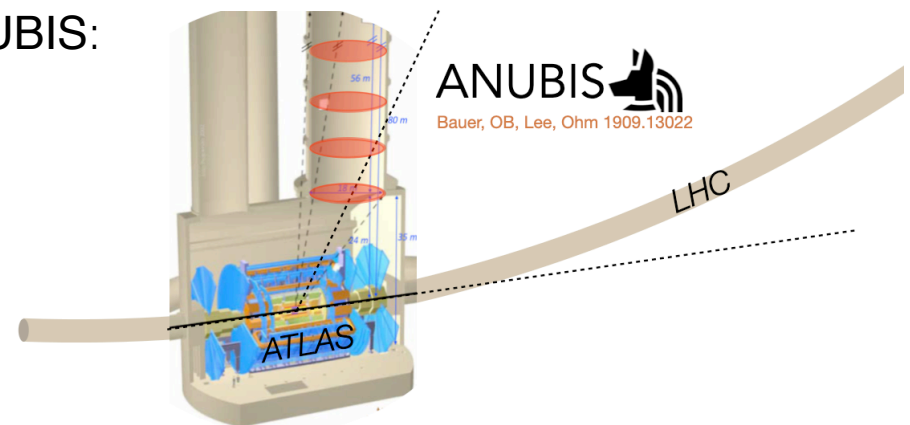


The concept:



## 2. LHC-adjacent LLP experiments, eg. ANUBIS: cover very long lifetime phase space on smaller budgets

- Opportunity to pursue precision timing/  
tracking ideas: could provide continuity  
for existing SLAC silicon infrastructure



# Long-Term: Beyond the LHC

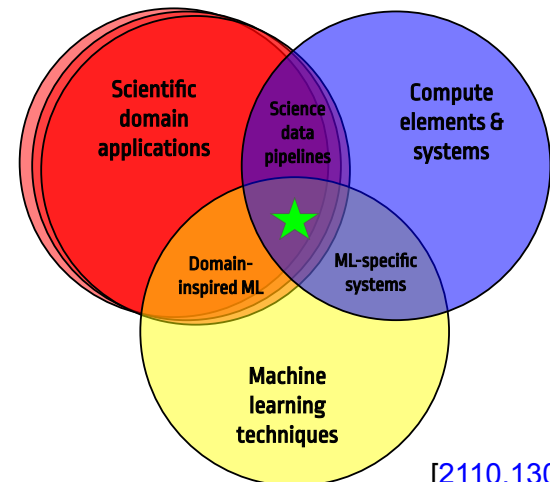
## ❖ Future colliders

- Colliders are unique tools!
  - Novel C<sup>3</sup> opportunity taking off with SLAC leadership
- Personal interest in future silicon high-granularity calorimeters & readout technology
- Experienced advocate and community organizer for long-term strategic planning (eg. Snowmass, APS)



## ❖ Cross-field applications of fast ML/ anomaly detection across sciences

- *Accelerator control & optimization, data reduction*, eg. at LCLS
- *Model-independent/real-time classification*, eg. DUNE, automatic phase identification at SSRL



[2110.13041]

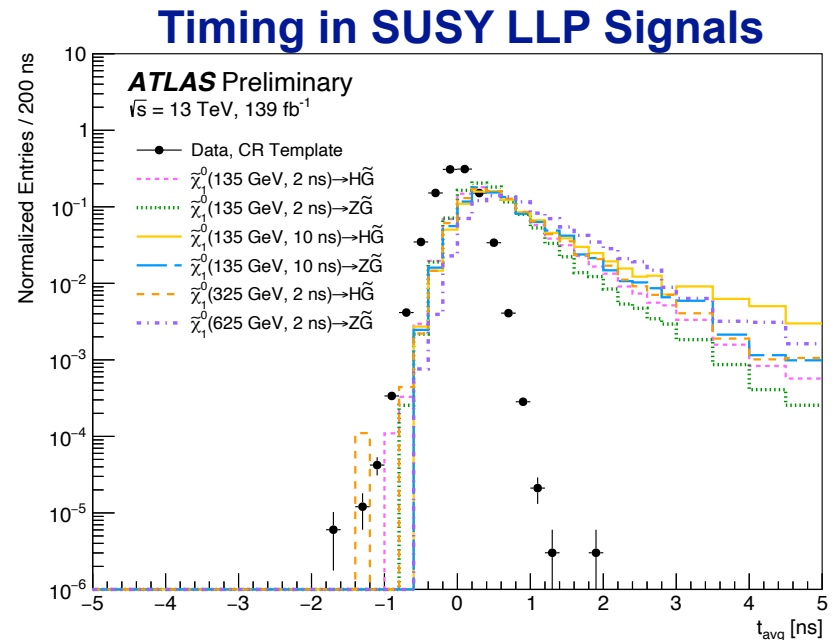
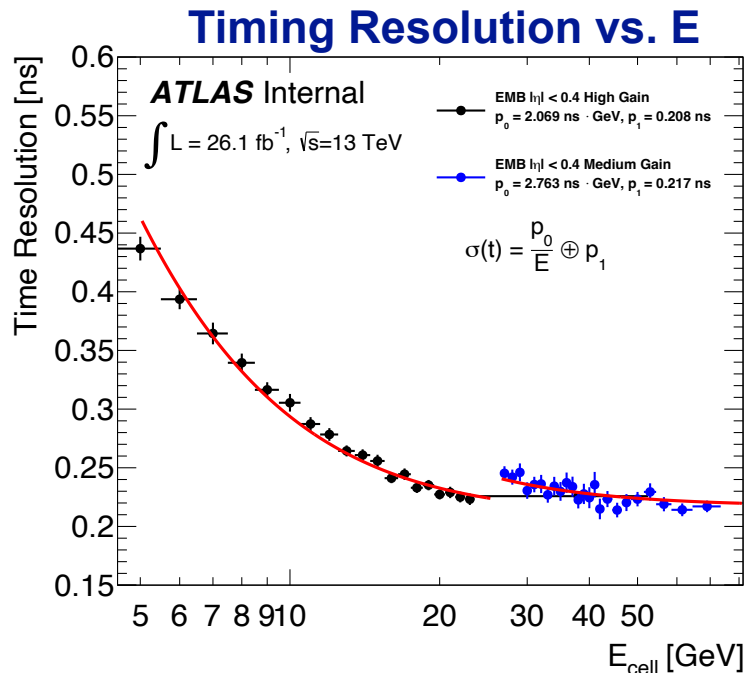
# Conclusions

- **Now more than ever, particle physics has a well-diversified search effort with exciting discovery prospects**
  - My focus: novel search ideas and machine learning applications (long-lived particles, anomaly detection)
- Performance of **instrumentation** is crucial...
  - Ensure success of ATLAS HL-LHC upgrades and brainstorm future readout advances
- .. as is the quality of the **scientific community**
  - Key collaboration avenues beyond EPP: Technology Innovation, LCLS, Accelerator, and more
  - Ongoing commitment to cultivating inclusive & equitable organization of the field
- **International collider research** provides unique reach towards BSM prospects
  - Long-term planning for future experimental program can start now!

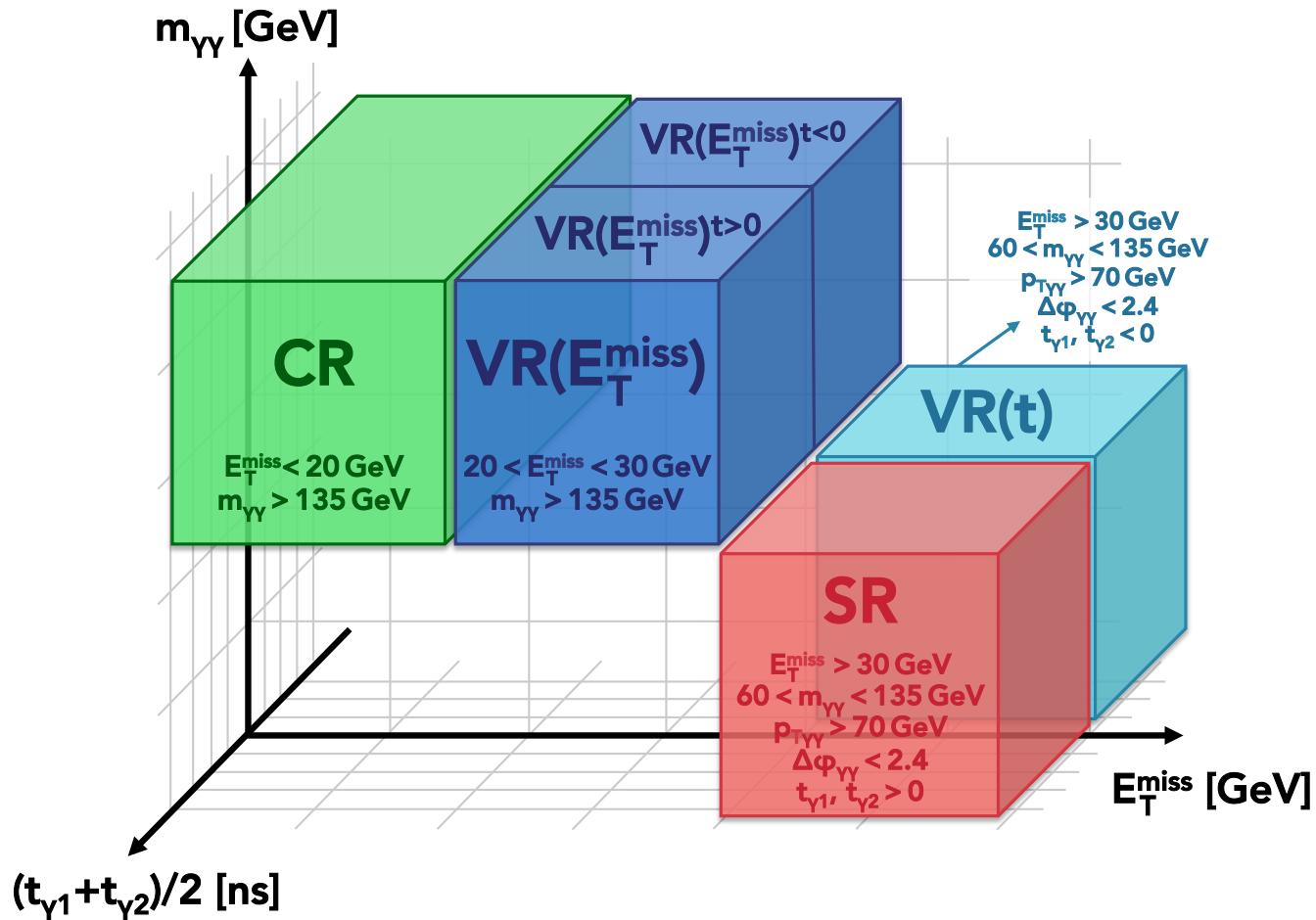
# Backup

# LLPs in LAr: Timing

- Calculated from calorimeter samples using LAr optimal filtering coefficients (OFCs)
  - Determined by middle layer maximum energy deposit ( $\max E_{\text{cell}}$ )
  - Online  $\sim 1$  ns resolution, calibrate offline with  $W \rightarrow e\nu / Z \rightarrow ee$  to reach  $\sim 200$  ps (dominated by beamspread)
- Photons from the decay of an LLP will be *late* with respect to the bunch crossing time: timing is highly discriminating for LLPs with lifetimes  $O(\text{ns})$



# Displaced Diphoton Vertices



# LLPs Towards Run 3

## • Run 2 Highlights

- LLPs  $\rightarrow$  e/ $\gamma$  objects
- Displaced (high  $d_0$ ) leptons: exclude pair-produced slepton decays up to  $\sim 500$  GeV for  $\sim 0.1$  ns lifetimes (flavor dependent) using extended tracking out to 30cm

## Run 2 Displaced Leptons

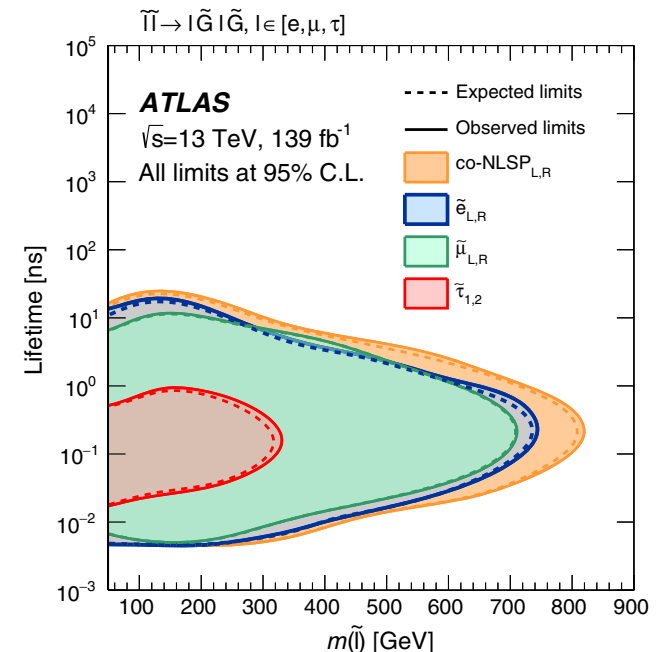
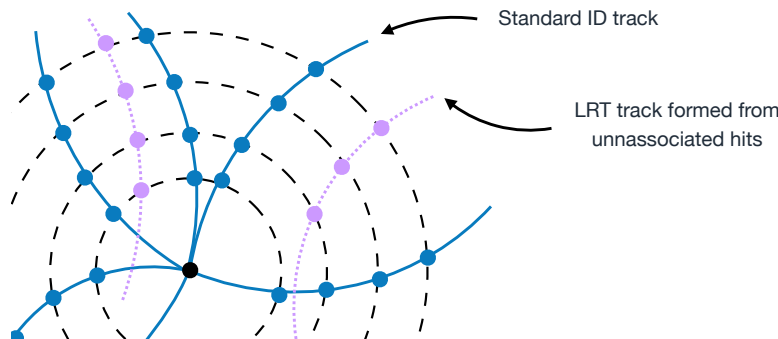
[PRL 127 (2021) 051802]

| Topology                                              | Trigger*                    |
|-------------------------------------------------------|-----------------------------|
| if $\geq e$ , $p_T > 160$ GeV                         | HLT_g140_loose              |
| else if $\geq 2e$ , $p_T > 60$ GeV                    | HLT_2g50_loose <sup>5</sup> |
| else if $\geq 1\mu$ , $p_T > 60$ GeV, $ \eta  < 1.07$ | HLT_mu60_0eta105_msonly     |

\*no tracking in triggers

## • ! New for Run 3:

- Large radius tracking: additional ID tracking pass run after standard tracking on leftover hits with relaxed tracking cuts
- Displaced lepton triggers: considerable expansion of trigger acceptance  $d_0$  and lower  $p_T$  threshold by including LRT



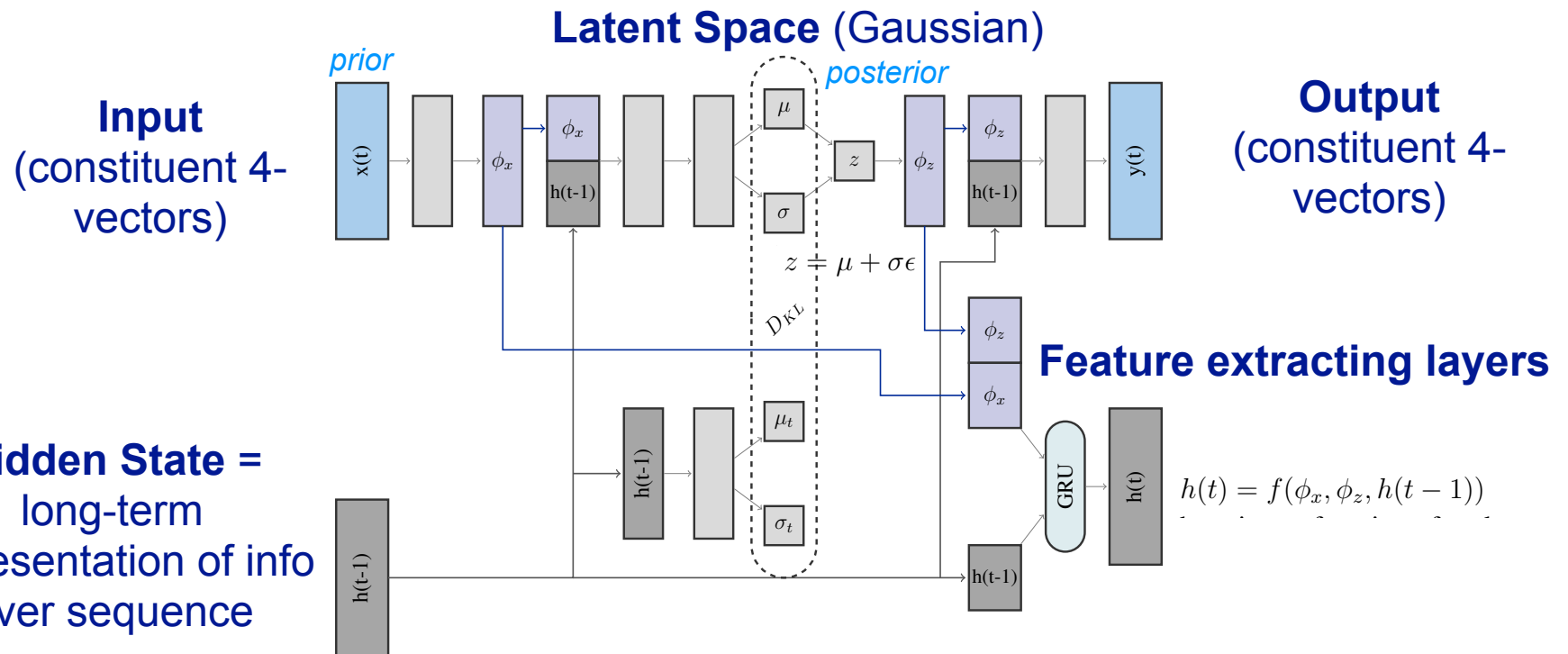
# VRNN Architecture

- **Variational RNN**: recurrent neural network (RNN) that updates a VAE latent space at each time step; accommodates variable-length input sequences
- Define *anomaly score* per jet as a function of the KL divergence loss term:  $AS = 1 - e^{-D_{KL}}$
- Train directly on data (avoid data/MC discrepancies in QCD)

$$\mathcal{L}(t) = |\mathbf{y}(t) - \mathbf{x}(t)|^2 + \lambda D_{KL}(z || z_t)$$

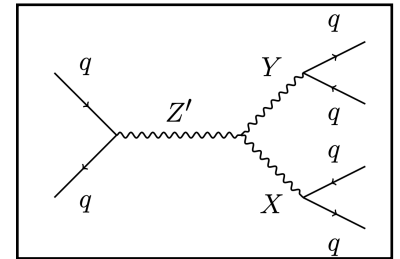
Mean-squared reconstruction error

Kullback-Leibler Divergence



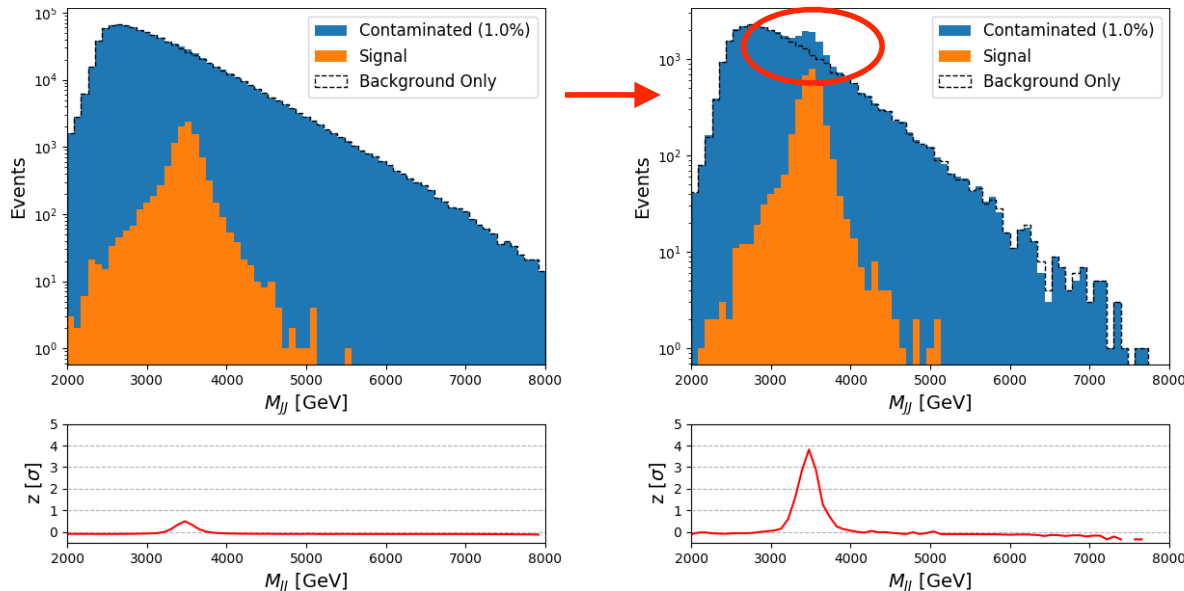
# VRNN in Action

- VRNN for anomalous jet tagging developed in simulation via the LHC Olympics community anomaly detection challenge [[2101.08320](#)]
- Achieve sensitivity with resulting jet-level anomaly score to both 2- and 3-particle decays over QCD/multijet
- ➔ VRNN paper published using this dataset [[2105.09274](#)]



**$m_{JJ}$ , QCD + signal**

No Selection

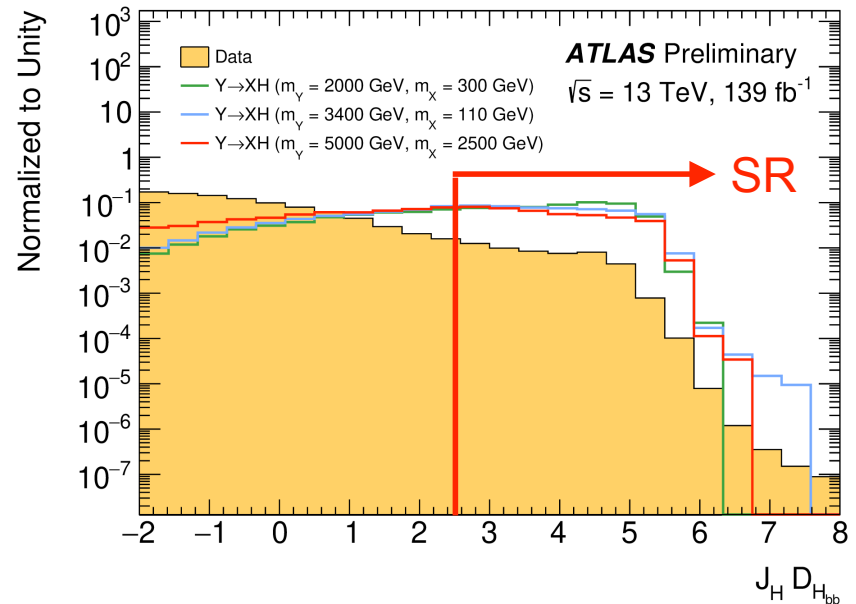
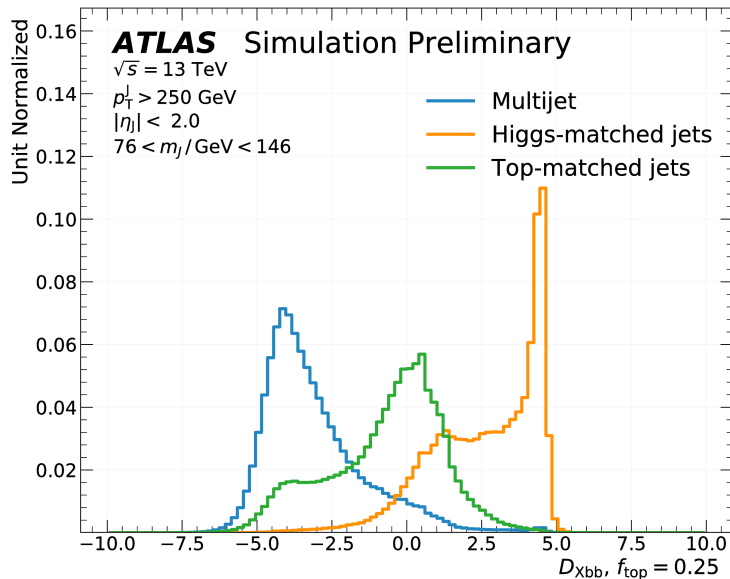


Cut on VRNN anomaly score

# Neural Net $H \rightarrow b\bar{b}$ Tagging

- Neural net-based double b-tag algorithm to select Higgs vs. dijet or top backgrounds [ATL-PHYS-PUB-2020-019]
  - Train over large-R jet  $p_T/\eta$  and up to 3 subjet b-tagging scores
  - Outputs: three class probabilities  $\rightarrow$  discriminant  $D_{Hbb}$
- ➔ Tag Higgs boson using 60% WP and  $f_{top}=0.25$  as per central FTag recommendation

$$D_{Xbb} = \ln \frac{p_H}{f_{top} \cdot p_t + (1 - f_{top}) \cdot p_{QCD}}$$

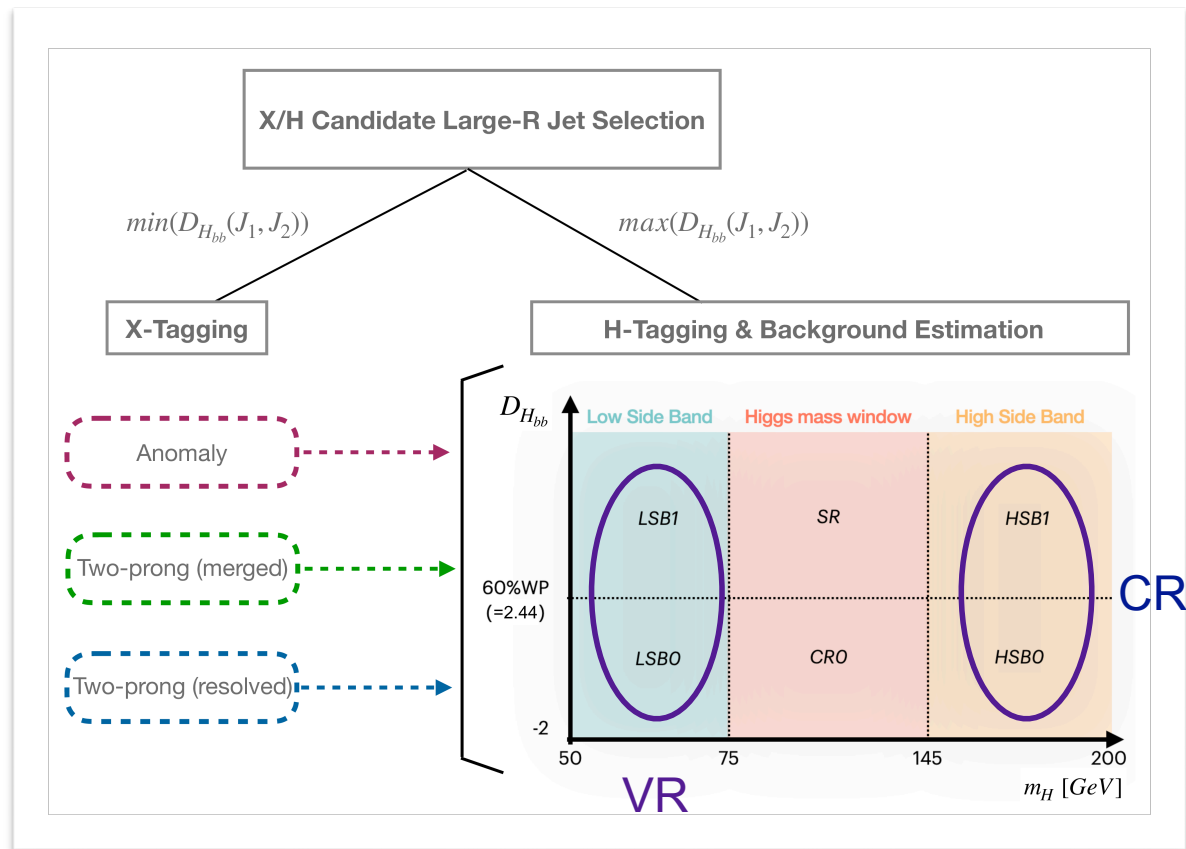


# Analysis Flow

1. **Large-R jet trigger:**  $J_1(p_T) > 500$  GeV and  $m_{JJ} > 1.3$  TeV
2. **Ambiguity resolution:** jet with highest  $D_{Hbb}$  score is Higgs candidate
3. **X-tagging:** AS of X candidate  $> 0.5$  (plus 2-prong regions)
4. **Higgs tagging:**  $D_{Hbb}$  of H candidate  $> 2.44$



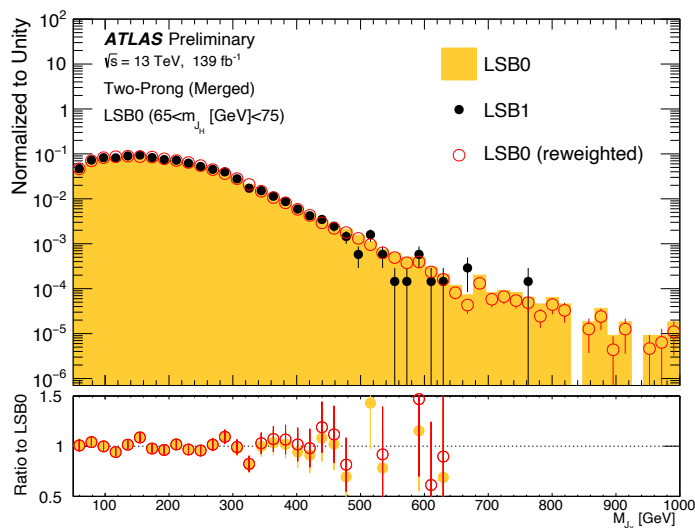
- ▶ **SR selection:**  $75 < m_H < 145$  GeV
- ▶ **Background estimation:** DNN-derived reweights for untagged high sideband ( $HSB0 \rightarrow HSB1$ )
- ▶ **Validation:** low sideband (LSB)



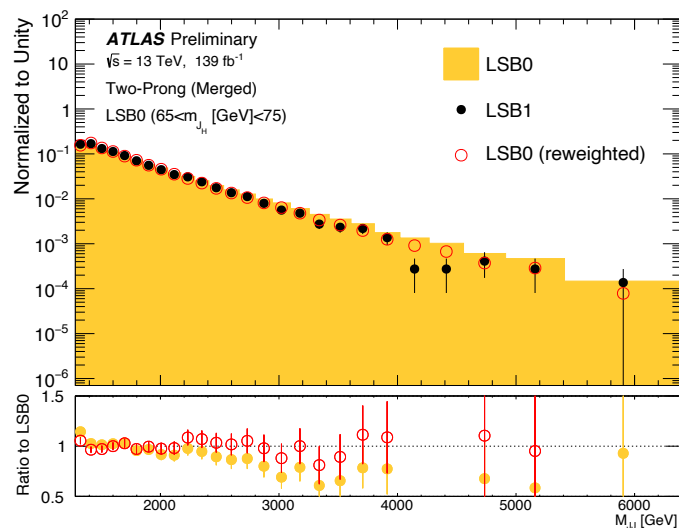
# Background Estimation

- Fully data-driven background estimation (~97% multijet processes)
- Derived from data template in high Higgs mass sideband that fails H tagger score, reweighted to shape in H-tagged region
- Build **DNN** to provide a reweight for each event
  - 3 fully-connected inner layers, 20 neurons each
  - Train inclusively in X-tagging over variables associated to the Higgs large-R jet (4 vector, 4-vectors of leading & subleading track jets associated to Higgs, # tracks)
  - Minimized on log-likelihood ratio of tagged to untagged regions'
- Systematics on DNN training region, statistical power of training sample, LSB non-closure

## LSB Validation



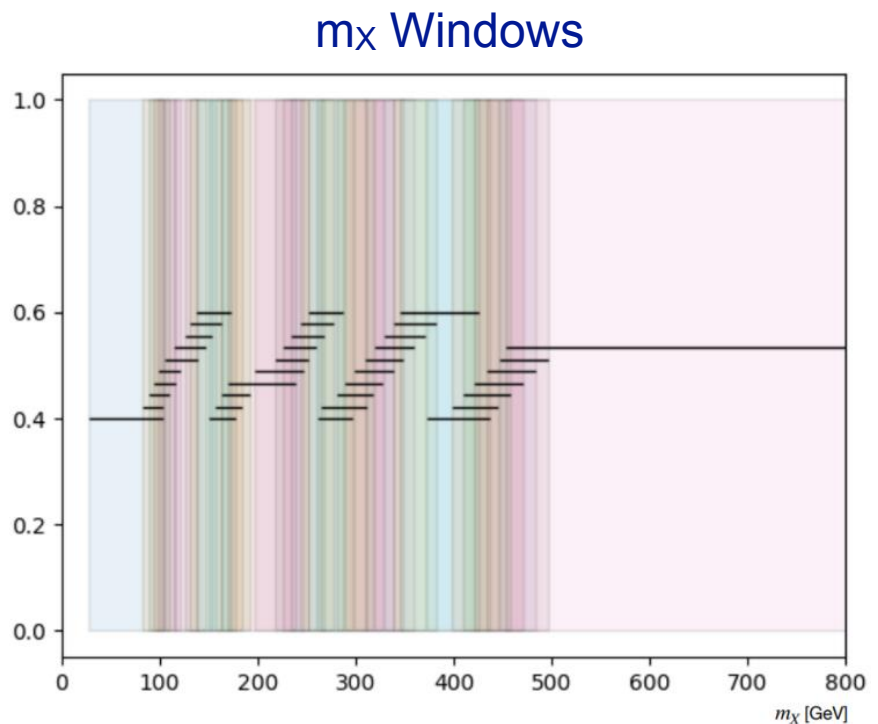
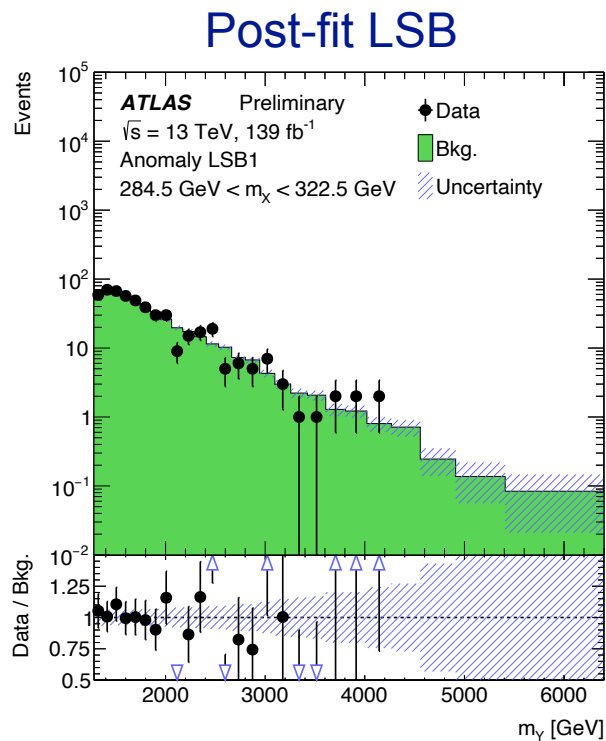
$m(X)$



$m(XH)$

# $Y \rightarrow XH$ Statistical Analysis

- Fit  $m_Y$  across overlapping categories of  $m_X$ 
    - Bins chosen based on signal mass resolution
  - Use BumpHunter as signal model-independent “excess finder” [[1101.0390](#)]
    - No significant ( $p\text{-val} < 0.01$ ) excess across  $m_X$  bins in the LSB VR
- ➔ No interpretation in anomaly region (no signal systematics)



# $Y \rightarrow XH$ Systematic Uncertainties

## Background

- Determined inclusively in  $m_x$ , and then applied to each exclusive  $m_x$  bin

### 1. DNN Source Systematic

- Difference in resulting mJJ distribution due to the choice of training region
- O(1-10)% effect across mJJ

### 2. DNN Bootstrap Systematic

- Statistical error from neural network performance determined via the bootstrap procedure
- O(1)% effect across mJJ

### 3. Non-Closure Systematic

- Determined in the LSB as the difference between reweighted LSB0 and LSB1 data, with smoothing
- Characterizes additional mis-estimation of data in the VR after determining weighting parameters from the HSB
- Negligible for low mJJ, O(10)% effect in the tails

## Signal

- Flat **luminosity uncertainty** of 1.7% (as measured with LUCID)
- **Jet uncertainties** implemented with standard variations from jet/ $E^{miss}$  CP group
  - Included for both large-R (merged and resolved) and small-R (resolved only) jets
  - Rtrk Baseline, Modeling, Tracking, TotalStat, Closure uncertainties
  - JER Mass and  $p_T$  variations
- PDF variation uncertainties
  - **ISR/FSR** included as flat 3% uncertainty
- XbbSF uncertainties

# VRNN Anomaly Score

- Preprocessing (right)
- Sequence Ordering: decreasing kt distance from hardest constituent
- Training: 16 neurons per intermediate layer, 500 epochs
- Results: sensitive to 2 and 3 prong signals, while less mass correlated than typical high-level substructure variables

## Algorithm 1: Jet Boosting

### Start

Boost jet in  $z$  direction until  $\eta_{Jet} = 0$

Rotate jet about  $z$  axis until  $\phi_{Jet} = 0$

Rescale jet mass to 0.25GeV

Boost jet along its axis until  $E_{Jet} = 1\text{GeV}$

Rotate jet about  $x$  axis until hardest constituent has  $\eta_1 = 0, \phi_1 > 0$

**if** Any constituents have  $\Delta R > 1$  **then**

Remove all constituents with  $\Delta R > 1$

Rebuild jet with remaining constituents

Repeat from start

**else**

continue

**end**

**if** Number of constituents  $> 20$  **then**

Keep up-to the first 20 constituents, ordered in  $p_T$

Rebuild jet with remaining constituents

Repeat from start

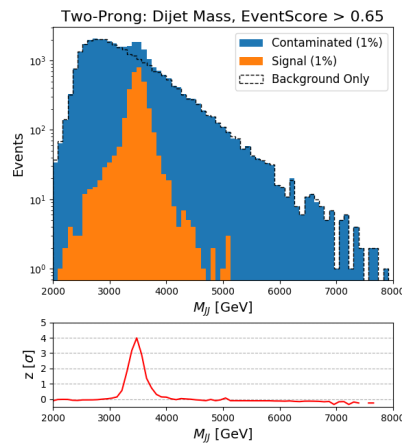
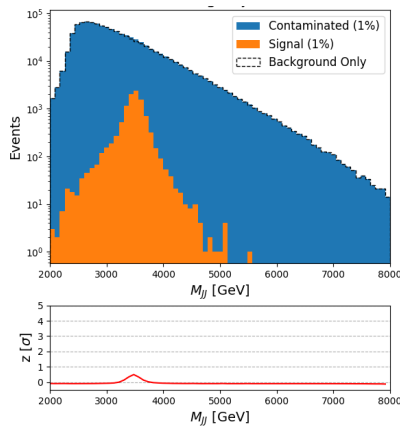
**else**

continue

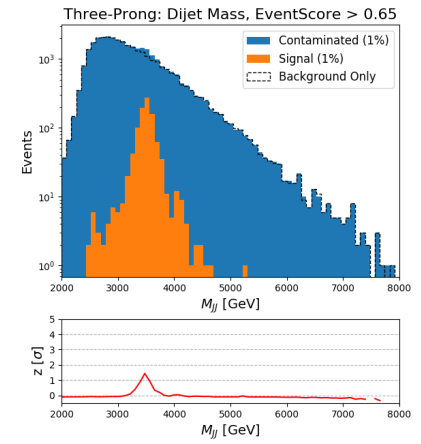
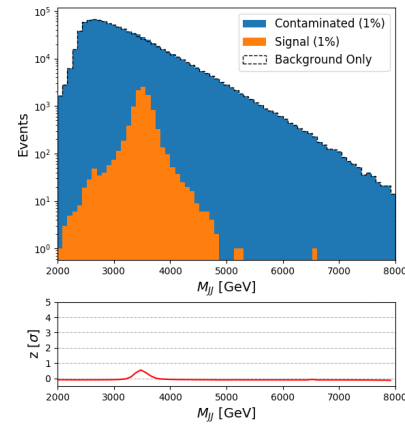
**end**

Reflect constituents about  $\phi$  axis such that the second hardest constituent has  $\eta_2 > 0$

## Two Prong Jets



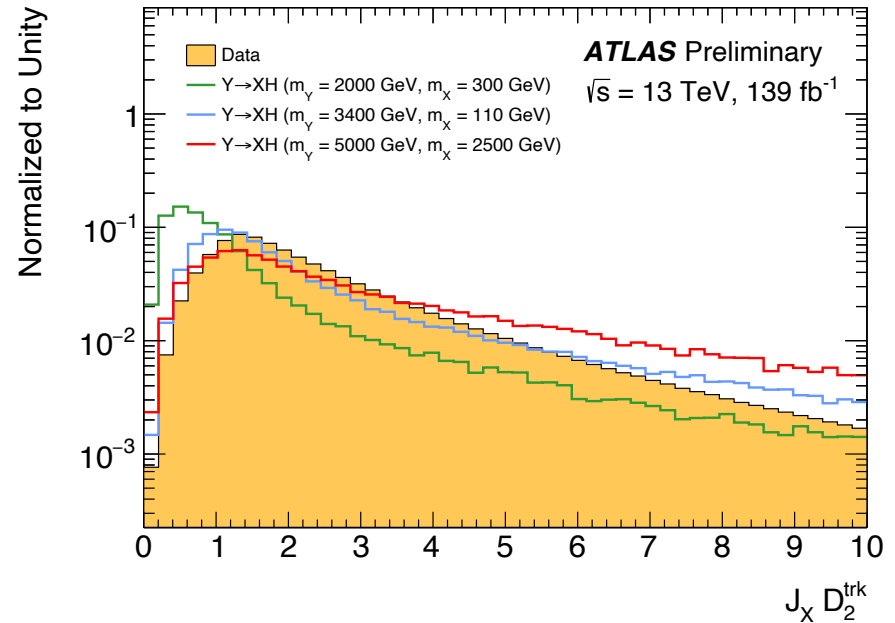
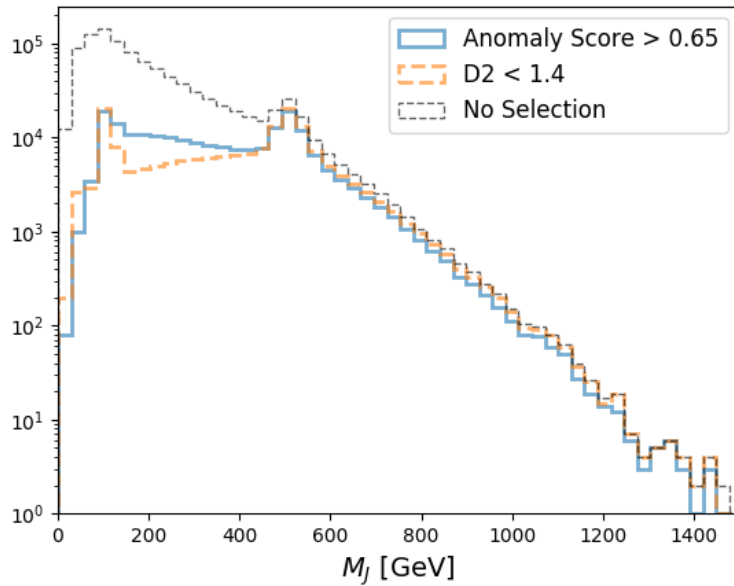
## Three Prong Jets



# AS Comparison to D2

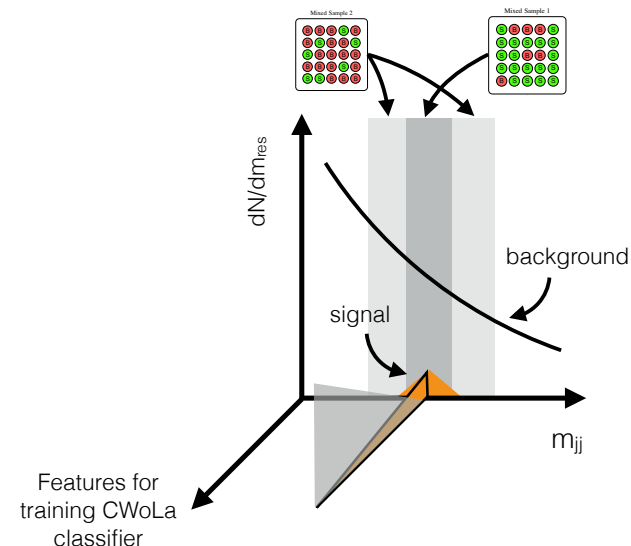
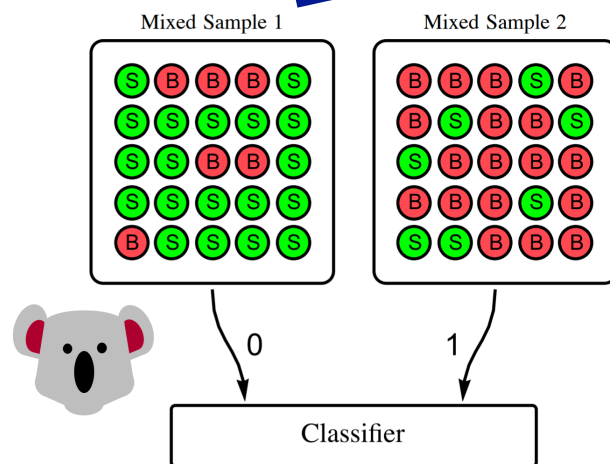
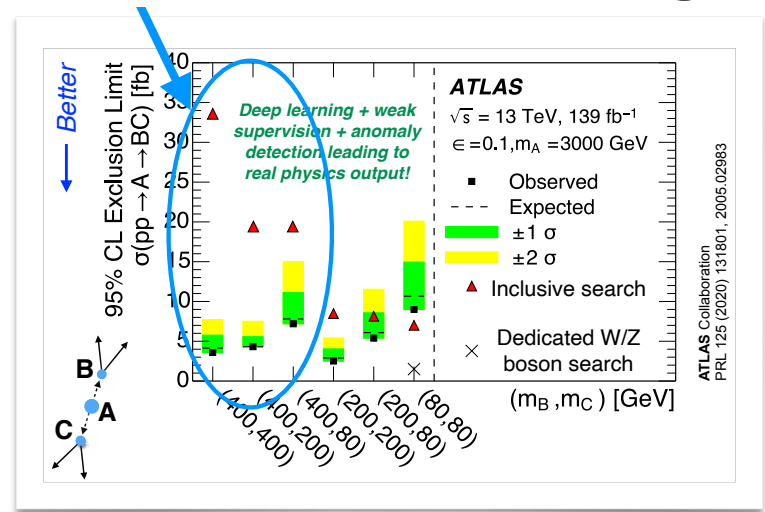
- Dataset = 2-prong % contaminated
  - Selections:  $D2 < 1.4$  /  $AS > 0.65$  (equivalent background rejection)
  - AS creates less mass sculpting than substructure variables
- In  $Y \rightarrow XH \rightarrow qqbb$ , cut on  $D2_{\text{trk}} < 1.2$  (merged) or  $> 1.2$  (resolved)

Contaminated: Leading Jet Mass, Shape Comparison



# CWoLa Weakly Supervised Learning

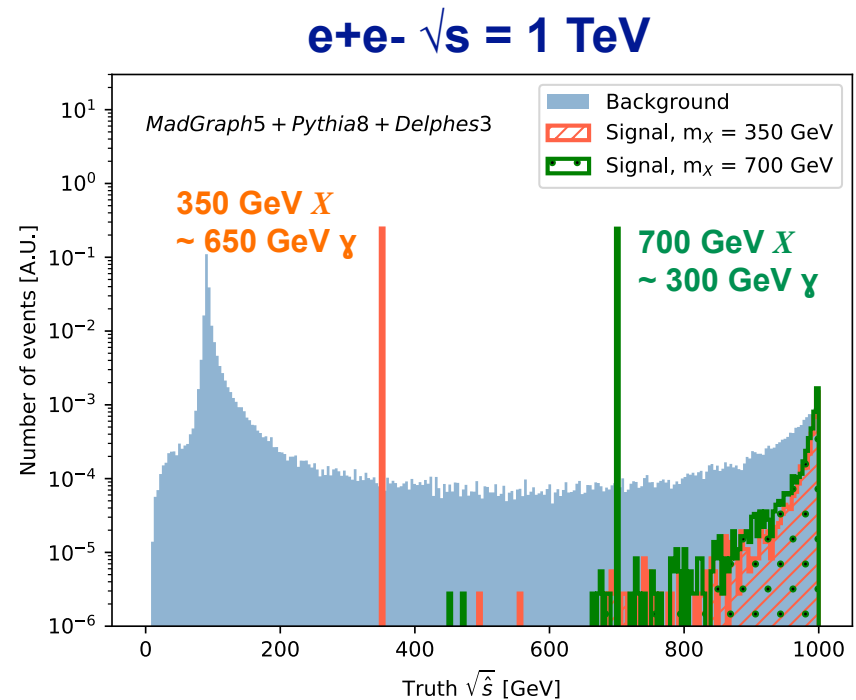
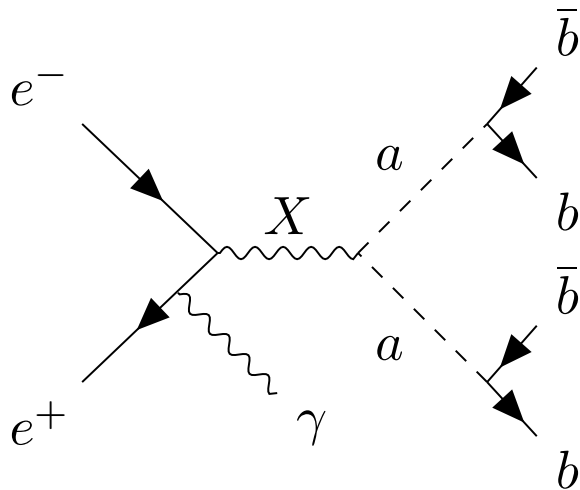
- Classification without labels (CWoLa) [[1708.02949](#)]: NN trained in signal region vs. sideband is sensitive to signal vs. background characteristics
  - SR and SB defined in windows of  $m_{jj}$ , each region has different fraction of signal
  - NN input training features = two leading jet masses
- ➔ First application of **weakly supervised** learning from ATLAS! [[PRL 125 131801](#)]
- ➔ Outperforms inclusive search at high mass hypotheses



[1708.02949](#),  
[1805.02664](#)

# CWoLa in $e^+e^-$ Collisions

- **Radiative return:** “scan” new particle masses with ISR photons, à la dijet invariant mass bump hunts
- Apply CWoLa method with *high- and variable-dimensional inputs* with [Particle Flow Networks](#): model an event as an unordered, variable-length set of jets
  - Up to 15 jets per event & 10 features per jet: 4 vector ( $p_T$ ,  $\eta$ ,  $\phi$ ,  $m$ ), b-tagging bit, 5 N-subjettiness variables
  - ➔ 150 input features per event

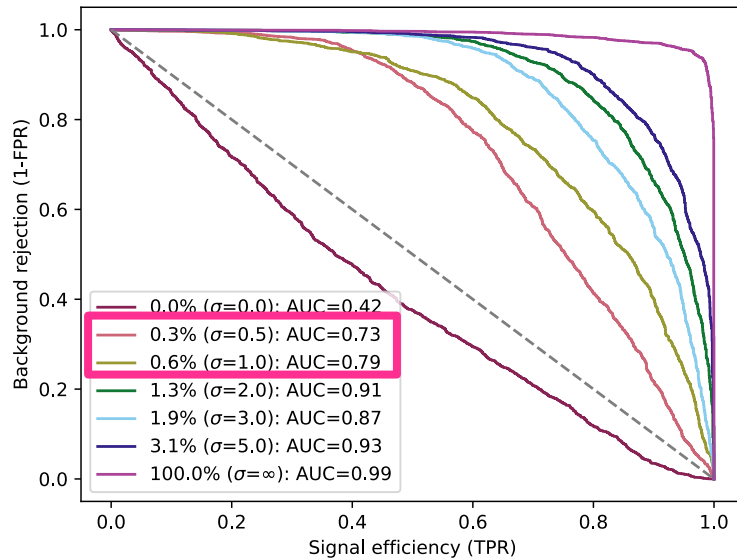


[\[arXiv:2108.13451\]](#)

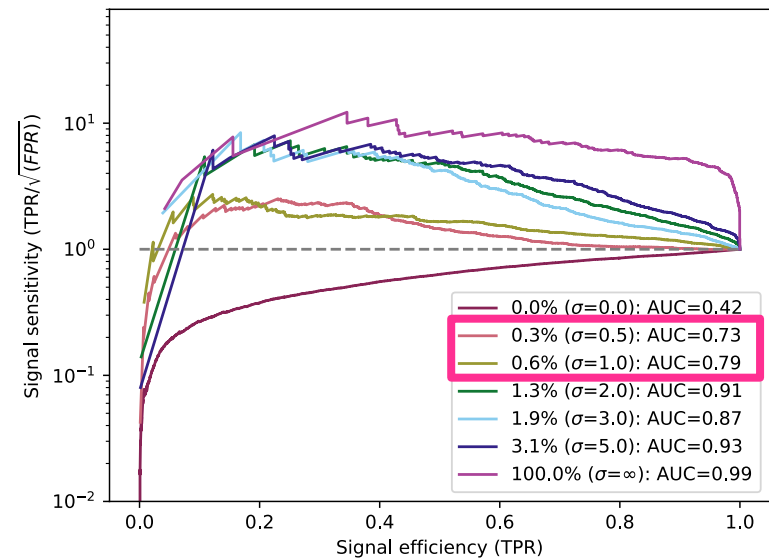
# CWoLa in $e^+e^-$ Collisions

- Select signal and background in  $\pm 25$  GeV windows in  $\sqrt{s}$  around the resonance mass (SR = [675, 725]) with sideband in  $\pm 50$  GeV windows on either side (SB = [625,675) U [725,775))
- Train with a variety of signal contaminations:  $\sigma=0.0, 0.5, 1.0, 2.0, 3.0, 5.0,$  and  $\infty$  (eg. all S vs. all B)
- Significance Improvement Characteristic (SIC): sensitivity proxy that gives multiplicative factor by which the NN can improve signal significance
- ➔ Enhance sensitivity to signal contaminations down to 0.3% by a factor of  $\sim 3$

### ROC: X=700 GeV vs. bkg



### SIC: X=700 GeV vs. bkg



[\[arXiv:2108.13451\]](https://arxiv.org/abs/2108.13451)

# HL-LHC Upgrade: Physics

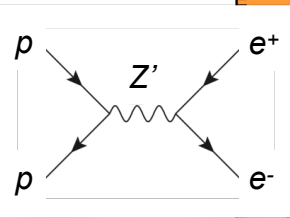
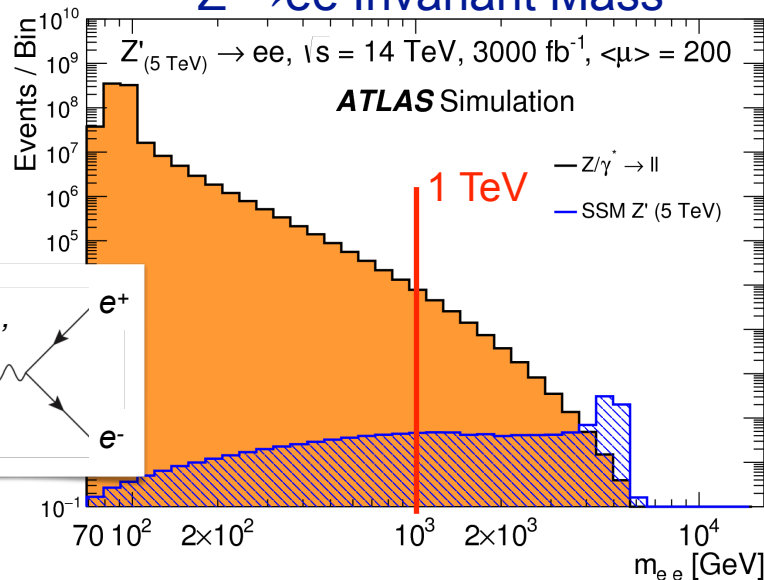
- Key physics drivers motivate precision reconstruction of electron/photon energy & time

1. High expected dynamic range (eg. massive  $Z' \rightarrow ee$  with high E electrons)
2. Precise mass resolution for measurements of key SM processes (eg. di-Higgs: small, narrow  $m_{\gamma\gamma}$  peak on top of large irreducible background)
3. Ensure that photons from  $H \rightarrow \gamma\gamma$  are mostly digitized on High gain and minimize gain intercalibration systematic  $\rightarrow$  new 2 gain scheme

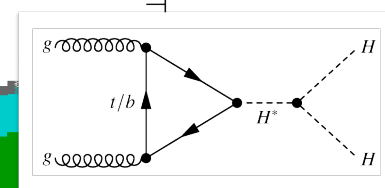
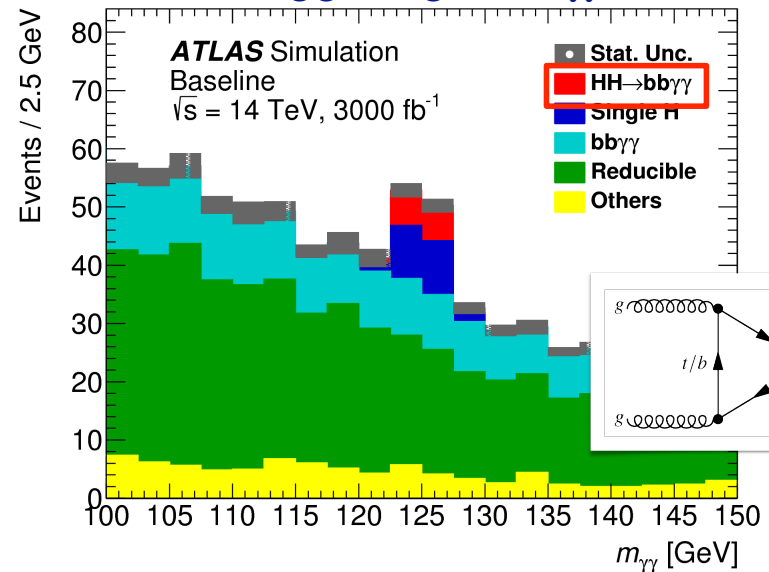
| Resolutions [GeV] | ggF  | HH   |
|-------------------|------|------|
| Pessimistic       | 2.64 | 2.06 |
| Optimistic        | 1.99 | 1.62 |

[ATLAS-TDR-027](#)

## $Z' \rightarrow ee$ Invariant Mass

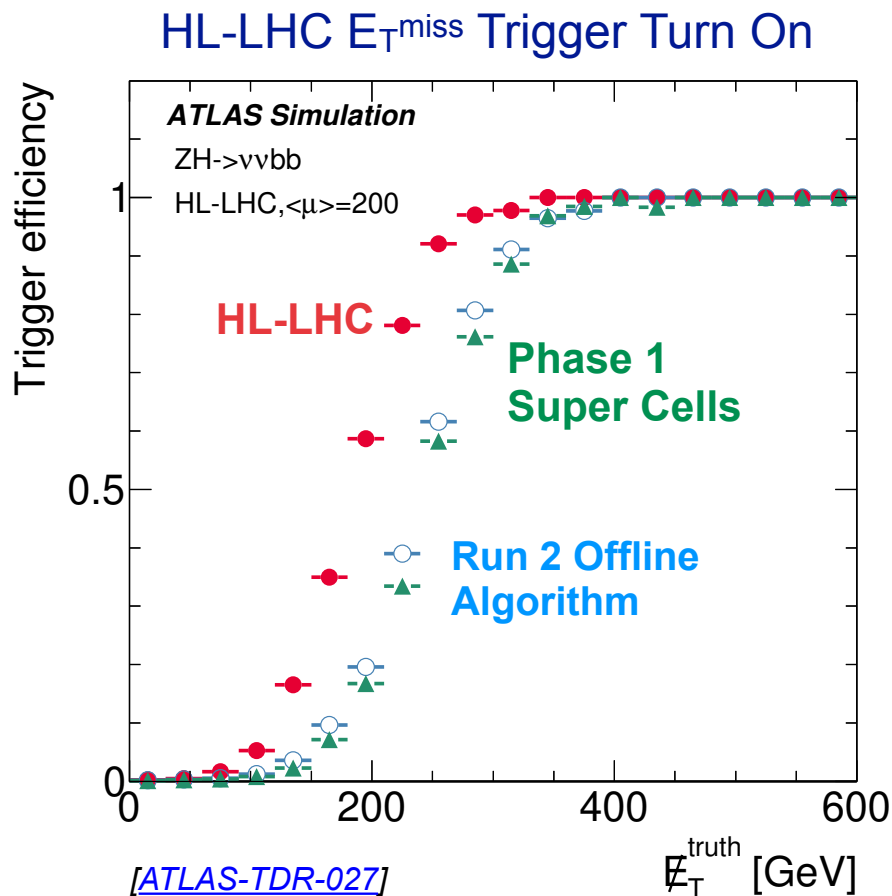


## Di-Higgs Signal $m_{\gamma\gamma}$



# HL-LHC Upgrade: Triggering

- New trigger/DAQ requirements: rate will be increased 10x to 1 MHz, latency 5-10x to 10  $\mu$ s
- Motivates a new LAr readout architecture  $\rightarrow$  free-running all digital design with no on-detector pipeline
  - **Already installed (“Phase-I”)**: Super Cells to provide finer granularity to trigger
- For HL-LHC: Read out *entire LAr calorimeter with full precision* at 40 MHz LHC bunch crossing frequency
  - Data rate = 40 MHz x 16 bits x 2 gains x **128 chans** x 1524 boards =  **$\sim$ 350 Tbps**
  - Results in lower trigger turn-on curves
  - Maintain ability to trigger on low- $p_T$  objects

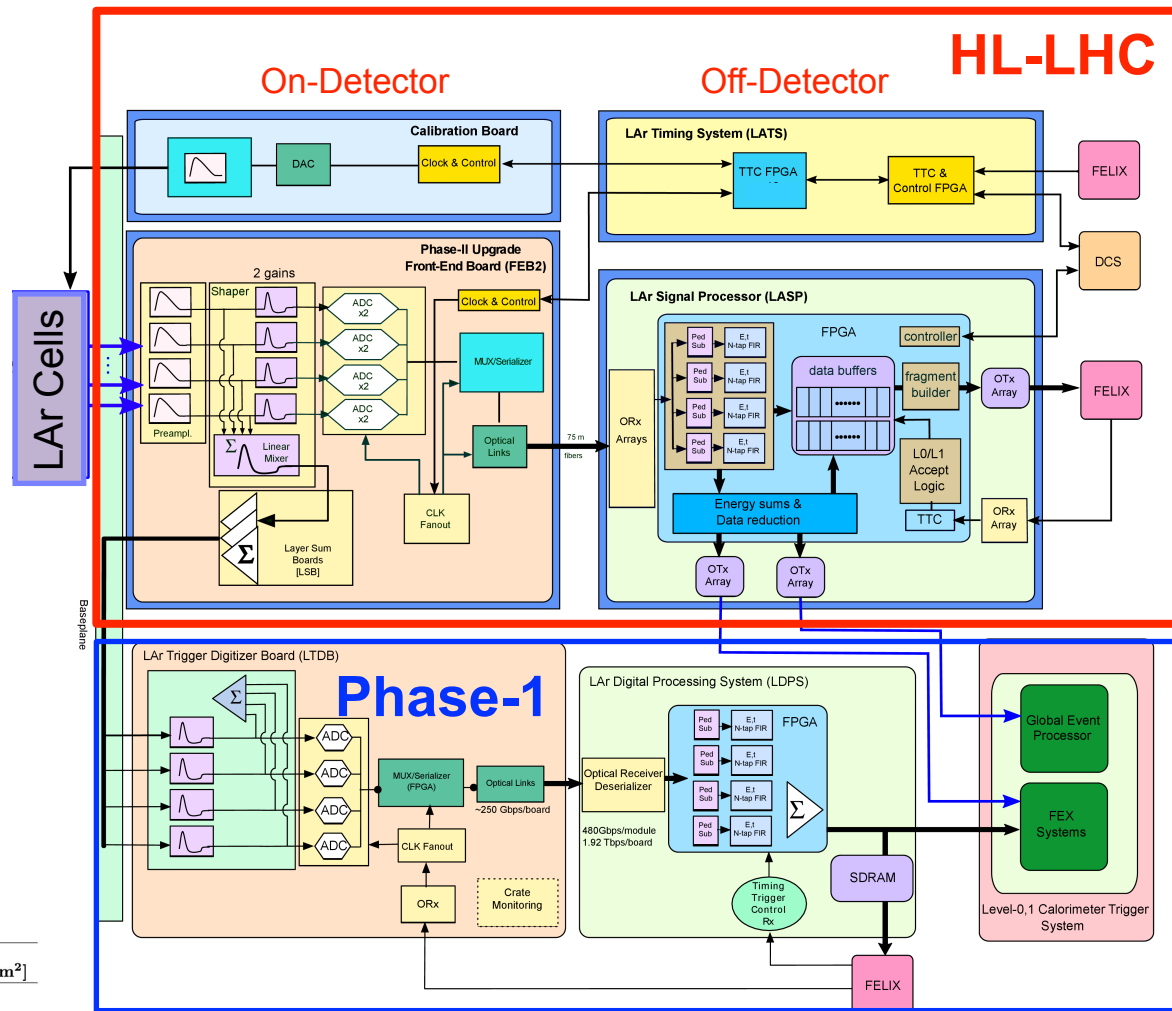


# HL-LHC Readout

- Phase-I: installed 2019-2022 & commissioning now!

## HL-LHC:

- Cover full energy range expected in a single cell (~50 MeV electronic noise to ~3 TeV)
- 16-bit DR with 11-bit precision (implemented in 2 overlapping 14-bit gain scales)
- Nonlinearity < 0.1% up to ~300 GeV
- Electronics noise < minimum ionizing particle (MIP) energy / intrinsic LAr resolution
- Radiation tolerance: full HL-LHC dose, eg. max TID 1400 Gy (1.5), NIEL <  $4.1 \times 10^{13}$  neq/cm<sup>2</sup> (2)

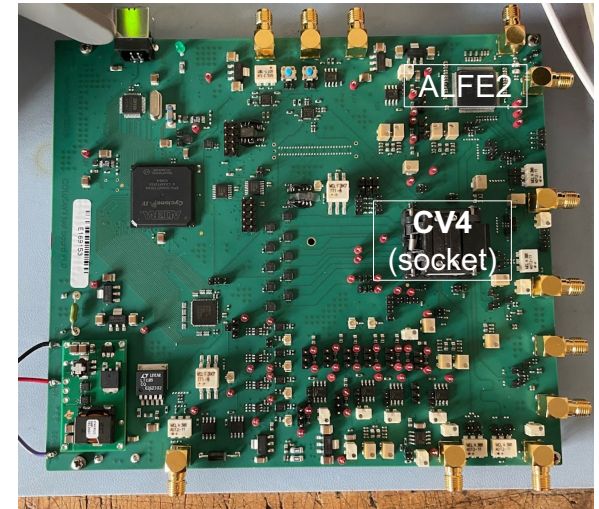


|                                       | TID [Gy]   | NIEL [neq/cm <sup>2</sup> ] | SEE [h <sub>&gt;20 MeV</sub> /cm <sup>2</sup> ] |
|---------------------------------------|------------|-----------------------------|-------------------------------------------------|
| FEC (barrel)                          | 1400 (1.5) | $4.1 \times 10^{13}$ (2)    | $1.0 \times 10^{13}$ (3)                        |
| FEC (endcap)                          | 210 (1.5)  | $6.0 \times 10^{12}$ (2)    | $1.2 \times 10^{12}$ (3)                        |
| LVPS between TileCal fingers (barrel) | 430 (1.5)  | $1.1 \times 10^{13}$ (2)    | $2.8 \times 10^{12}$ (3)                        |
| HEC and FEC LVPS (endcap)             | 81 (1.5)   | $2.0 \times 10^{12}$ (2)    | $4.1 \times 10^{11}$ (3)                        |
| LVPS new position (barrel)            | 18 (1.5)   | $5.1 \times 10^{11}$ (2)    | $1.1 \times 10^{11}$ (3)                        |
| LVPS new position (endcap)            | 33 (1.5)   | $5.2 \times 10^{11}$ (2)    | $8.6 \times 10^{10}$ (3)                        |

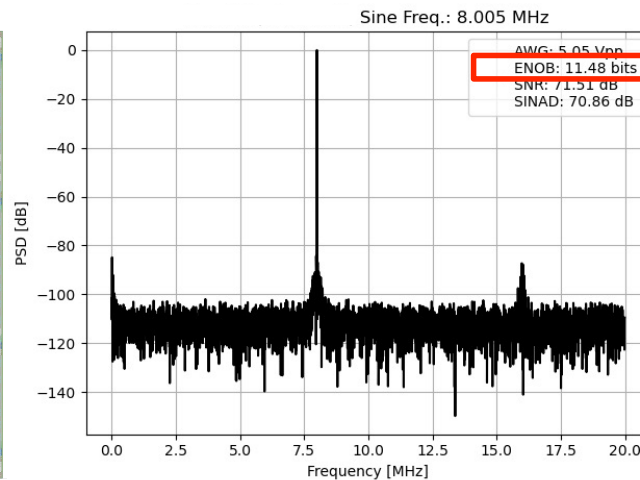
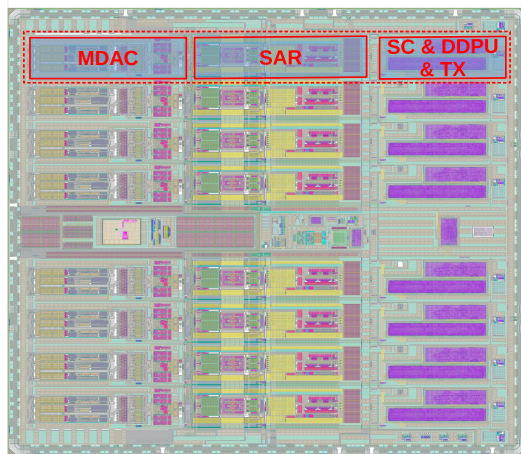
# ADC Characterization

- COLUTA ADC ASIC: full custom 40 MSPS in 65nm CMOS with 8 channels
  - > 14 bit dynamic range with > 11 bit ENOB
  - Radiation tolerance: irradiate chip & measure SEUs, TID, NIEL (full HL-LHC dose in ~few hours)
- ➔ Takeaways: custom ASICs are key for unique HEP DAQ needs
  - Final Design Review in October to start pre-production (need 80k chips total produced & tested)

## ADC Testboard



## COLUTAv4

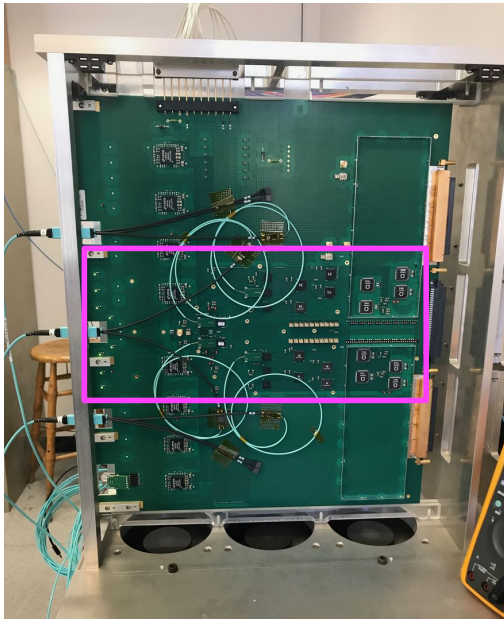


## Radiation Testing

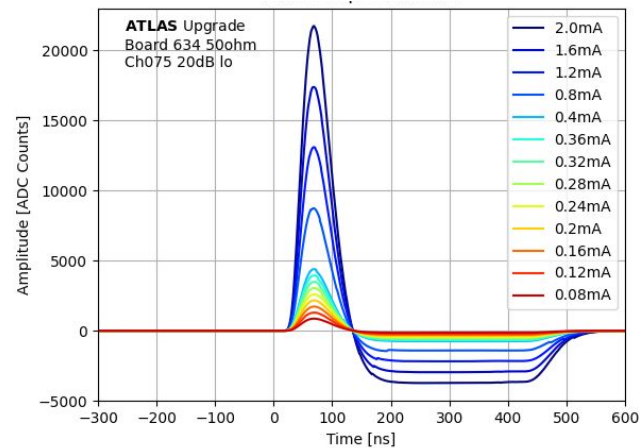


# Slice Testboard

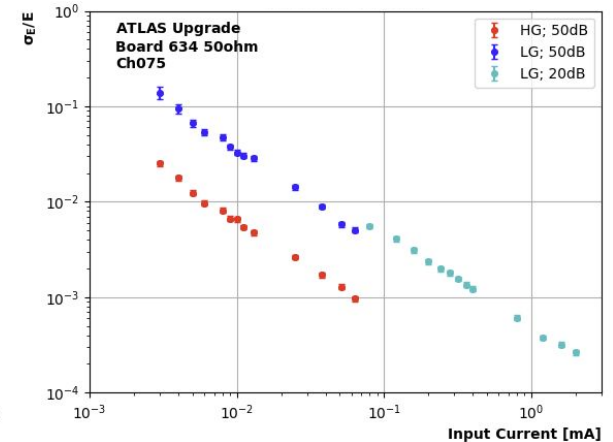
- **Slice Testboard** = pre-prototype of FEB2 (32 of 128 channels)
  - Characterize performance of 3 custom ASICs in full readout chain (PA/S, ADC, IpGBT)
  - For large pulses, energy resolution  $< 0.02\%$  (cf. spec  $0.25\%$ ), timing resolution  $\sim 50$  ps (dominated by system jitter)
- ➔ **Takeaways: front end design is as crucial to experimental success as detector itself**
- Preliminary Design Review in December: full 128-channel FEB2 prototype + system tests



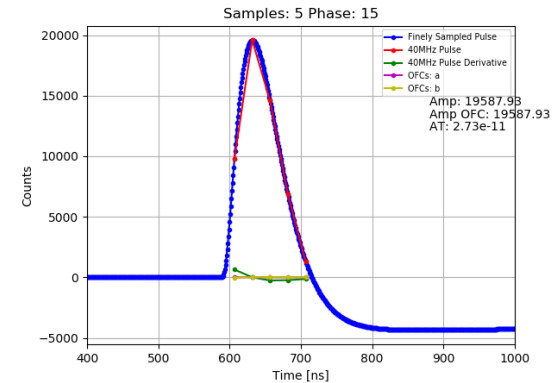
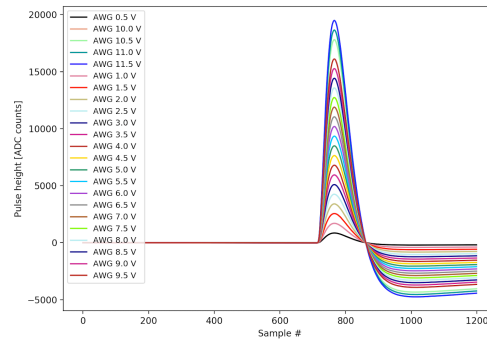
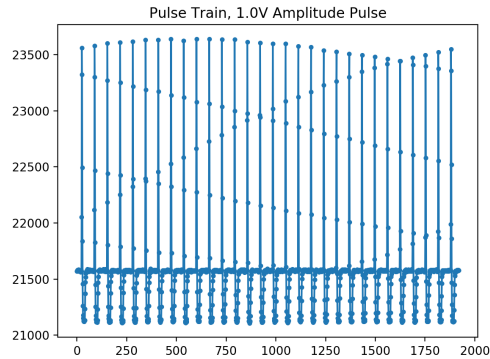
## LAr Pulses



## Energy Resolution



# LAr Pulse Analysis



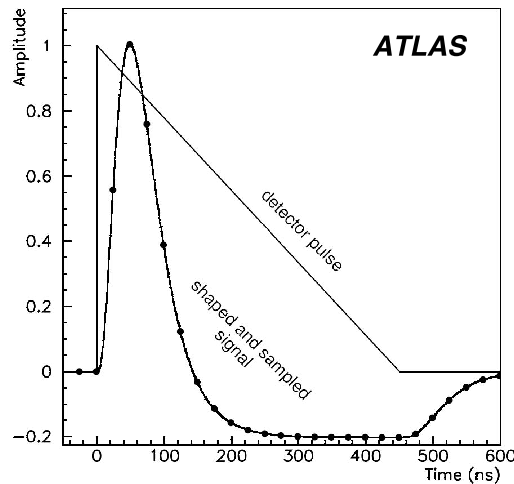
AWG sends a pulse train of known amplitude to ADC chip, sampled at different phases



Pulse train is interleaved to reconstruct fine pulse for each amp. Check that maxima and zero point match across amplitudes



Samples from one phase (containing peak) and derivatives are used to calculate OFCs, then used to find energy and timing of each pulse



## Optimal Filtering Coefficients

$$A = \sum_i a_i S_i,$$

$$\tau = \frac{1}{A} \sum_i b_i S_i$$

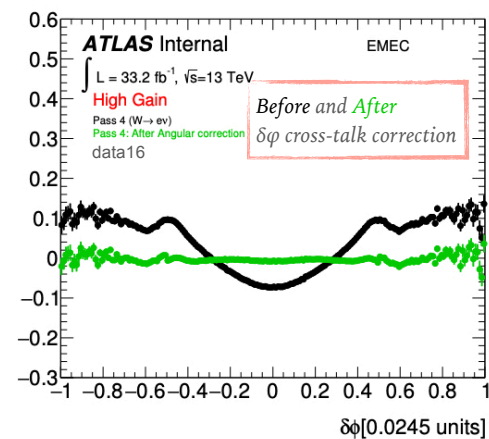
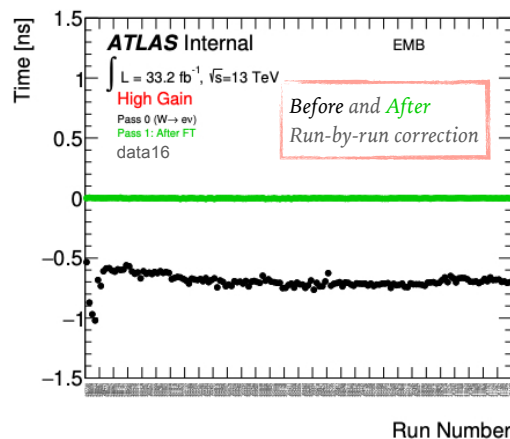
# Offline LAr Timing Calibration

- Times are calibrated offline via a series of passes to synchronize cells and improve resolutions for analysis use
  - Uses electrons from Wev data to calibrate, Zee data to validate
  - Studies have shown (as expected from MC) that electrons and photons behave similarly for timing purposes

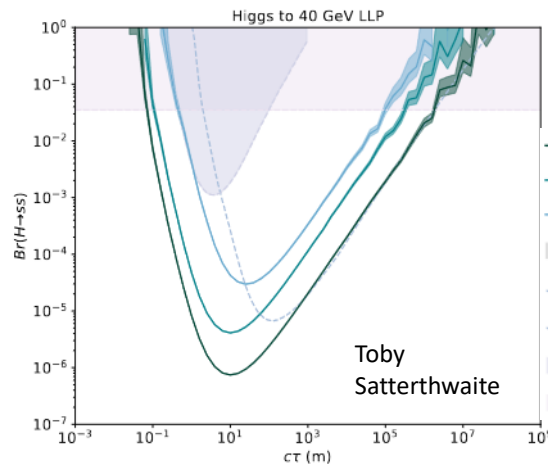
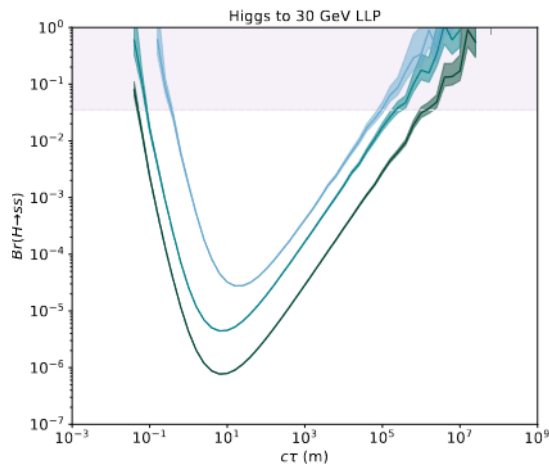
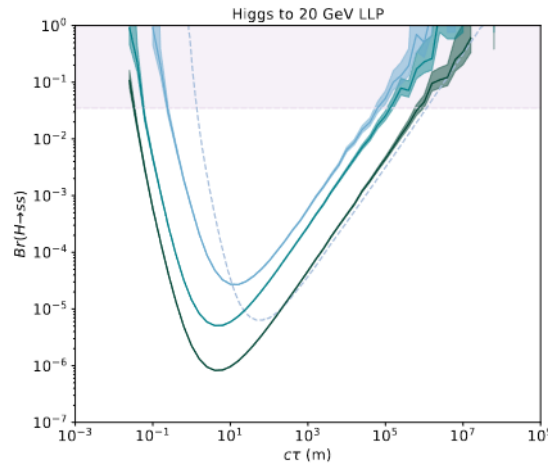
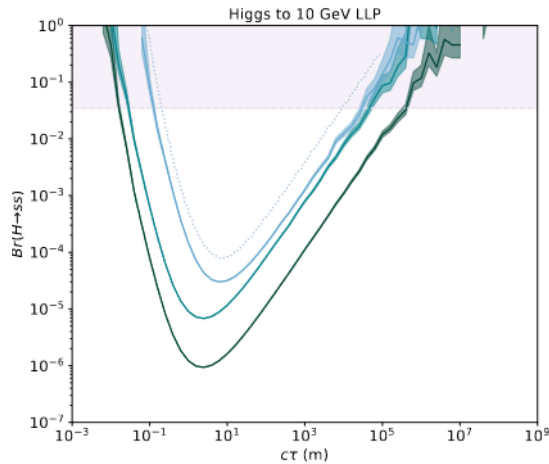
- Corrections obtained per gain and per IOV (interval of validity for OFCs) for cells
- ~10 channels (of ~46K) per year are flagged as “bad” for time variations within an IOV

- Calibration achieved via a series of passes to empirically remove averaged/fitted variations

- ▶ Pass 0: time-of-flight (TOF) from PV to cell
- ▶ Pass 1: average time per FEB
- ▶ Pass 2: average time per channel
- ▶ Pass 3: energy-dependence (by slot)
- ▶ Pass 4: middle-layer cross-talk (by slot, based on  $\delta\eta$ ,  $\delta\phi$ )
- ▶ Pass 5: inter-layer cross-talk (by slot, based on  $f_1$ ,  $f_3$ )
- ▶ Pass 6: average time per channel (pass 2 repeated)
  - ▶ Added because patterns re-emerged after applying other passes (passes are actually subtly correlated with each other)



# ANUBIS Sensitivity



## Sensitivity Studies

- Sensitivity assumed from 50 (90) observed events for the shaft (ceiling) geometry
- Extrapolated from ATLAS MS search

- ANUBIS ceiling
- ANUBIS PX14 shaft -- cavern or shaft decay
- ANUBIS PX14 shaft -- shaft decay
- ANUBIS sensitivity  $\pm 1\sigma$
- ⋯ CODEX-b ( $\mathcal{L} = 1 \text{ ab}^{-1}$ )
- - - MATHUSLA ( $\sqrt{s} = 14 \text{ TeV}$ ,  $\mathcal{L} = 3 \text{ ab}^{-1}$ )
- ATLAS limit ( $\sqrt{s} = 13 \text{ TeV}$ ,  $\mathcal{L} = 36.1 \text{ fb}^{-1}$ )
- $H \rightarrow \text{Invisible}$  limit ( $\sqrt{s} = 13 \text{ TeV}$ ,  $\mathcal{L} = 3 \text{ ab}^{-1}$ )

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J. Burr, LLP Forum [[8 Dec 2022](#)]

# Resources

## ❖ Research team

- 1 postdoc + 2 PhD students + 1 (partial) firmware engineer for ~3 years
- Encourage & mentor students through dedicated funding opportunities, eg. NSF GRFP applications

## ❖ Labs (in order of space)

- Electronics development: fast ML to FPGAs (FPGA development board)
- ANUBIS/small-scale LLP detectors
- Future calorimeter development

## ❖ Miscellaneous: travel for self/team, summer salary, etc.

## ❖ Grant strategy

- Establish sole funding: NSF CAREER/DOE Early Career, Sloan, Simons, etc.
- Join SLAC ATLAS base grant at next renewal
- Dedicated AI initiative grants (eg. “Artificial Intelligence Research for High Energy Physics” from DOE)
- Dedicated FOAs for inclusion (eg. RENEW, FAIR)

# Societal Benefits

- Technological spillover; eg. MRIs/proton therapy, World Wide Web
  - LHC as a “sandbox” for data science & engineering
- Training a skilled future workforce
- Outreach opportunities & enhanced scientific literacy in general public



[CERN Courier, 2018]

