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### Dark matter searches in ATLAS and complementarity with other experiments

CATERINA DOGLIONI - UNIVERSITY OF MANCHESTER & LUND UNIVERSITY @CATDOGLUND, SHE/HER



European Research Cou

### Outline

- Finding dark matter invisible particles at the LHC
- LHC data taking and real-time analysis (or: making the most of the data for DM searches)
- [Hopefully] confirming dark matter discoveries, across complementary experiments
- Synergistic activities (ideas for collaborations?)

# Finding <del>dark matter</del> invisible (& visible) particles at the LHC

We can't see dark matter, hear dark matter (or talk about dark matter?)



### Current discovery machine: the Large Hadron Collider

#### LHC collisions schedule:

June 2015 - December 2018: Run-2
 2022: beginning of Run-3: ongoing
 ~2027: beginning of Run-4 (HL-LHC)

LHC 27 kn

### Our current experiment: ATLAS detector

#### First Run-3 collisions in ATLAS: July 2022





# Motivation for DM@colliders

How do we search for DM at colliders, depending on its properties?

- Generally assume some properties for the DM particle, our assumptions:
  - interacts with SM particles → we can **produce it at colliders**



**Caveat:** very simplified diagram

dark, stable → invisible to detectors







# Searches for DM invisible particles at colliders

Detector covers all the solid angle and catches ~all visible particles





# Searches for DM invisible particles at colliders

Dark matter doesn't interact significantly with our detectors  $\rightarrow$  invisible





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# Searches for DM invisible particles at colliders

#### Dark matter doesn't interact significantly with our detectors $\rightarrow$ invisible



invisible particle (DM)

# Signature of invisible particles (like Dark Matter):

### missing (transverse) momentum ( $E_T^{miss}$ )







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# A "monojet event" at ATLAS



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# Generic production of invisible particles





# Generic production of dark matter?



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# Weakly Interacting Massive Particles

A **minimal** option to make up 100% of the relic density:

only add one particle to the Standard Model







### Weakly Interacting Massive Particles

A **minimal** option to make up 100% of the relic density:

• only add one particle to the Standard Model



- stable TeV-scale particle with weak-force-sized interactions
  Weakly Interacting Massive Particle (WIMP)...
  ...conveniently appearing in models that also solve other
  - problems in particle physics (e.g. supersymmetry)
  - Beautiful and simple, almost *miraculous!*

More about non-WIMP DM & dark sectors in Sukanya's slides



# Weakly Interacting Massive Particles

A **minimal** option to make up 100% of the relic density:

only add one particle to the Standard Model



Experimental advantage: many experiments can detect it in different ways complementary discoveries



Dark matter at ATLAS

Collaborations

# Dark Matter mediators at the LHC

If there's a force other than gravity, there's a **mediator**, and the LHC could **detect** it via its **visible decays**: (WIMP) *simplified models* are popular LHC search benchmarks





### Dark Matter Forum & Working Group

https://lpcc.web.cern.ch/content/lhc-dm-wg-dark-matter-searches-lhc Phys. Dark Univ. 26 (2019) 100371 & references within









• Even simple models can encapsulate **relevant experimental characteristics** 

representing wider classes of theories





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# A generic search for WIMP DM: "X+MET"



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# DM interpretation of ATLAS jet+MET search



### Parallels: visible and invisible mediator-based searches



#### Detection of the DM **mediator**, via its **visible decays**:



DM

DM

### Parallels: visible and invisible mediator-based searches

Signal (rare)

Ź

New mediator (e.g. a more

massive Z boson)

-6666







Detection of the DM **mediator**, via its **visible decays**:





### Parallels: visible and invisible mediator-based searches



Digression: LHC data taking and dark matter mediators

### Recreating dark matter/dark sectors in the lab: challenges



Trying to stay as model-agnostic as possible, while exploiting what the LHC is good at: focus on the presence of a resonance (alongside EFTs/more complete theories)

added bonus: resonance searches are bread&butter at colliders  $\rightarrow$  robust analysis toolkit available

#### **Challenges:**

- 1. This kinds of processes are very **rare**
- These challenges can be met 2. Many other processes may look the same ( $\rightarrow$  large **backgrounds**) with non-standard analysis workflows!
- 3. Often **we don't know** how the resonance decays look like









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# Our "Big Science" problem to solve: too much data

- The new physics signals we are looking for are rare
  → need enormous amount of collisions to produce them
- Their backgrounds look similar and are much larger
- Problem: recording all LHC data takes 400000 PB/year [Ref]
  - up to 30 million proton-proton collisions/second (MHz)
  - ~ 1-1.5 MB/data per collision event, including raw data



after selection of "interesting" data



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LHC experiments need to select "interesting" events (=*trigger*) in real-time (milli/microseconds)





after selection of "interesting" data



# Are we missing rare dark matter processes?

#### Events selected by the trigger





Main challenge for resonance searches: large backgrounds and signal that looks very much like background

Number of events produced by the LHC



28

# Example: dijet decays of DM mediators

Selecting interesting events works for most of the LHC physics program...

...but it is not optimal for rare processes with high-rate backgrounds:

we cannot record and store all data, and trigger discards both background and signal

#### This prevented us from being sensitive to low-mass DM mediators decaying into jets



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### Limitations to record (more) data from trigger & DAQ







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### Limitations to record (more) data from trigger & DAQ



### to overcome these limitations:

Optimise code for efficiency (and sustainability)

Use **hybrid computing architectures** e.g. that can reconstruct particles from detector signals more efficiently Refine **trigger algorithms and selections** to get more of the data we need for our searches

#### Use non-standard analysis workflows that reduce (immediate) CPU use and storage needs

Compress the data









# A paradigm change for LHC experiments

### Asynchronous data analysis

First record and store data, then reconstruct/analyze it

### Real-time data analysis

Reconstruct/analyse data as soon as it is read out so that only (**smaller**) final-state information needs to be stored

**ATLAS:** Trigger Level Analysis **CMS**: <u>Data Scouting</u>, **LHCb**: <u>Turbo stream</u>







# (Near-)real-time analysis of LHC data



#### Perform as much "analysis" as possible in real time

- Reconstruction & calibration
- First preselection to skim "backgrounds"







#### **Reduced data formats:**

- Only keep final trigger objects (drop raw data)
- Save only "interesting" parts of the detector
- <u>Run-3, in progress:</u> A combination of the two

Caterina Doglioni - 2023/03/27 - UofM - TAU Wor ERC Consolidator Grant REALDARK (2021-2026) Dark matter at ATLAS

# ATLAS implementation: Trigger Level Analysis (TLA) \*





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Dark matter at ATLAS

# ATLAS implementation: Trigger Level Analysis (TLA) \*



- **software**: technical implementation and large-scale deployment
- **performance**: is a reduced data format "good enough" for a discovery"?
- **statistical analysis**: how to deal with unprecedented amounts of data?



### Filling the uncovered parameter space of low-mass resonances







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#### Collaborations

### Filling the uncovered parameter space of low-mass resonances



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#### Collaborations

### Filling the uncovered parameter space of low-mass resonances



You may have noticed: definitions of *low-mass/light* varies...

Low-mass mediators to a collider physicist in dijet searches: EW scale [0(100) GeV]

But this mediator can easily (?) be connected to less-explored lighter [o(GeV)] mediators

<u>Note:</u> see <u>this summary talk</u> / <u>this review</u> for searches where the mediator is feebly coupled and therefore displaced

### CMS / LHCb real-time analysis <u>dark photons</u>



# What's needed for dark matter discoveries: complementary experiments

Collaborations

Dan Hooper - Fermilab/University of Chicago

University of Chicago, Physics Colloquium

October 24, 2013

### Why colliders can't discover every/any kind of DM alone

- **Reason #1**: there are DM models that are not accessible at accelerator energies / intensities
- **Reason #2:** DM discoveries need complementary experiments that involve DM with **cosmological origin** 
  - Direct detection can **discover DM that interacts** inside the detector
  - Indirect detection can see annihilating/decaying DM through its decays



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### Why colliders can't discover every/any kind of DM alone

- **Reason #1**: there are DM models that are not accessible at accelerator energies / intensities
- Reason #2: DM discoveries need complementary experiments that involve DM with cosmological origin / can produce DM
  - Direct detection can **discover DM that interacts** inside the detector
  - Indirect detection can see **annihilating/decaying DM** through its decays
  - Accelerators/colliders can produce DM and **probe the dark interaction**



DM Complementarity

Collaborations

### A "global" view of WIMP dark matter

How do we compare results of different experiments in the most model independent way possible? European Strategy Update "Big Question"

Comparisons are possible only in the context of a model Essential to **fully specify model/parameters** and **be aware of limitations** 





Complementarity of colliders with direct (indirect) detection performed within the chosen benchmark models & parameters Caterina Doglioni - 2023/03/2/ , UotM, IAU Workshop ...more discussions with direct/indirect detection needed, see last part of the talk...

Collaborations

### Complementarity within simplified models

LHC DM Working Group, European Strategy Update Briefing Book, for non-WIMP examples, see Physics Beyond Colliders report

#### Higgs boson as mediator: colliders & direct detection

#### Preliminary, Granada May 2019 $\sigma_{sl}$ ( $\chi$ -nucleon) [cm<sup>2</sup>] XENON1T PRL 121 (2018) 11130 10<sup>-42</sup> - PandaX PRL 117 (2016) 12130 DarkSide-50 DarkSide-50 PRL 121 (2018) 08130 LUX 10<sup>-43</sup> PRL 118 (2017) 021303 DarkSide-Argo (proj.) DarkSide-Argo EPPSU s DARWIN-200 (proj.) the best 10<sup>-44</sup> JCAP 11 (2016) 017 HL-LHC: BR<2.6% Higgs PPG, arXiv:1905.03764 region to find HL-LHC+LHeC: BR<2.3%</p> PG. arXiv:1905.03764 10<sup>-45</sup> CEPC, FCC-ee, ILC, 50 BR<0.3% WIMP DM in! Higgs PPG, arXiv:1905.03764 FCC-ee/eh/hh: BR<0.025% 10<sup>-46</sup> s PPG, arXiv:1905.03764 WIN-200 (proj. $10^{-47}$ DarkSide-Argo (proj.) Higgs Portal model Direct searches, Scalar DM $10^{-48}$ Collider limits at 95% CL, direct detection limits at 90% CL 10<sup>3</sup> 10 10<sup>2</sup> European Strategy m, [GeV] DM SM DM W DM Η Z W DM SM MAN erc 1824 Lund European Research Council The University of Manchester UNIVERSIT shed by the Euronean

#### Generic scalar mediator: colliders & indirect detection



Health hazard : these plots are only valid for the couplings specified, in the limited space of a benchmark model!
Not to be used to deduce general things like:
"In the next 50 years we will exclude WIMP DM"
"Technique A is better than technique B to find DM"
For work on smaller masses and couplings, see

# What's needed for dark matter discoveries: new ideas, new tools, new collaborations

### The evolution of dark matter searches in the last decade



### DM complementarity at SnowMass2021

 Since the last Snowmass process (2013), there has been a fundamental shift in how we think about searches for dark matter

- We are in an **exciting exploratory phase** where new ideas can be implemented on short timescales
- Dark matter crosses every frontier
- In order to get a full picture of the "elephant", we need to combine information from different experiments
- How do we portray this complementarity?

Link to Community Planning Meeting session #150 - DM complementarity





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https://gordonwatts.github.io/snowmass-loi-words

#### **Word Clouds**

Word clouds are made by looking at the word frequency in the LOI's. The more frequent the word, the larger the font-size in the word cloud.

#### All LOI's



Led to a cross-frontier whitepaper from Cosmic, Energy and Neutrino Frontiers <u>https://arxiv.org/abs/2210.01770</u>

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### Snowmass complementarity: some examples of DM models



### Snowmass complementarity: WIMP



**EF** = Energy Frontier (e.g. ATLAS & future colliders)

**CF** = Cosmic Frontier (e.g. CTA...)

dark matter mass



### Snowmass complementarity: "dark photon"





DM Complementarity

Collaborations

### Snowmass complementarity: sterile neutrino



CF = Cosmic Frontier

NF = Neutrino Frontier

sterile neutrino mass



**ESCAPE** 

**Initiative for Dark Matter** 

in Europe and Beyond (iDMEu)

Online platform / series of meetings to discuss

dark matter synergies across all experiment &

theory fields, endorsed by European particle /

astroparticle and nuclear physics communities

**Dark Matter Test** 

Science Project Link

+ Snowmass 2021 (submitted input to P5)

Link to kick-off meeting: https://indico.cern.ch/event/1016060/

5 postdocs working in European institutes on

reproducible and sustainable dark matter

analysis (colliders, DD, ID)

in the European Open Science Cloud

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### (European) initiatives for DM complementarity

#### scientific outcome:



# **foundations:** (open) data & software tools

### More software&tools to make the most of the data in Danielle's talk

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# Passing the microphone to Sukanya and Danielle...

In the next few days: looking forward to talking to more trigger / machine learning / dark matter enthusiasts (but also learning more about neutrinos, catching up with old friends and meeting new friends!) What are we (Caterina, Sukanya, Danielle & closest collaborators in Manchester) going to do in the next 5 years?

## Timelines

### LHC Schedule for the next 5 years



# The REALDARK Project (ERC Consolidator)

Team: Tobias Fitschen, Sukanya Sinha (PDRAs), Max Amerl, Danielle Wilson (PhD), 1 RSE

Upgrade ATLAS trigger for next LHC run with new data-taking workflows (Partial Event Building)



DM @ colliders complementarity with accelerator experiments & astrophysics

Make **real-time analysis** widely usable for searches and measurements in ATLAS (and at the LHC)

Further exploration of the electroweak scale @ LHC(~100 GeV)

Sustainability and reusability of LHC/DM analyses, in terms of data and pipelines

Machine learning for data compression

Non-WIMP dark matter searches with non-standard jet signatures

European Research Council



Possibilities for collaboration with TAU / neutrino:
Real-time analysis / ML techniques for searches and measurements
Dark matter: theory and experimental synergies

# Danielle Wilson: Searches for dark jets with novel data-taking techniques and ML in ATLAS



But what if DM is not that simple?

→ look into more complex dark sectors, where DM could be embedded into the jets: *dark QCD/dark showers* 

We will need more information than "just the jets" in TLA: **partial event building** (still smaller than full event)



H. Russell, EPS-HEP 2019.

With this information, investigate different **ML techniques** to distinguish dark QCD/ordinary QCD based on jet content

Danielle's PhD project (co-supervisor: Mike Seymour):

- Make use of existing measurements && input from theory to define models of *dark QCD*
- Use PEB/ML to search for *dark jets* == hadronic-like jets with DM particles

# Max Amerl: Searching for dark matter with real-time analysis techniques at ATLAS

- Trigger leads ATLAS to save only *interesting* events (<< 1% of total events produced by LHC)
  - This works for most ATLAS physics...
  - ...but not for rare processes with large backgrounds, e.g. DM mediators
- **Solution:** do as much analysis as possible in the trigger system, and only save **smaller** final-state objects (e.g. jets, photons)
  - → Trigger Level Analysis (TLA)



Max's PhD project (co-supervisors: Darren Price (currently doing masterclasses)):

- Commission Run-3 jet trigger and Trigger Level Analysis stream with early data
- Search for dark matter mediators with the TLA technique in unexplored regions
- Share ATLAS searches data, results, and tools with the entire community searching for DM

### **Pratik Jawahar:** *accelerated anomaly detection* in the SMARTHEP European Training Network

- **"Too much data"** problem by no means unique to LHC physics
- Data is abundant in industry, so need fast decision-making (short time-to-insight)
- **Solution:** real-time analysis (RTA)
  - Tools to accelerate RTA in industry & research: machine learning, hybrid computing architectures (GPU, FPGA)

Pratik's PhD project (co-supervisors: Alex Oh, Jiri Masik):

- Commission Run-3 tracking trigger algorithms
- Employ machine learning solutions, especially unsupervised learning (anomaly detection), for new physics discoveries in dark sectors
- Use accelerators (GPU/FPGA) for particle tracking at the HL-LHC

SMARTHEP trains 12 (+N) PhD students 20 participants: industries, labs and academic institutions







### Backup slides

#### CATERINA DOGLIONI - LUND UNIVERSITY <u> @CATDOGLUND, SHE/HER</u> <u> http://www.hep.lu.se/staff/doglioni/</u>





## Dark matter and dark matter mediators

Synergies

### Mediator mass-coupling summary plot





increasing event size

### An example: some very exotic signatures

Mapping of exotic signatures to big picture of benchmark models not always easy
→ difficult to prioritize → may be difficult to
decide what exactly to include in trigger menu

Signatures with a **common denominator**: unusual tracks/energy distributions, more or less localized in the detector

How do we make sure we don't miss these events?

- 1. write dedicated trigger algorithms
- 2. save a mixture of raw data and trigger-level objects
- 3. save (custom-reconstructed) trigger-level objects only
- 4. save any of the above and reconstruct data later



EMERGING

NO JET

MONO-JET

Inspired by K. Pedro & C. Fallon's talk @ DMLHC2019 and by this twitter thread

5. [outlier detection]



DISPLACE

Introduction DM@LHC Data for DM searches DM@LHC, in context Synergies

### LHC production of new invisible particles

Production of invisible particles can be common in the SM use **standard candles** (Z boson) to search for non-SM production



Collaborations

### Example: looking up (to hints from astrophysics & more)

A change of paradigm from "DM == invisible particles"

(potentially low-mass) & "strongly interacting" DM particles will

- interact with **detectors** 
  - need to take this into account for collider searches!
- interact with **atmosphere & earth** 
  - use/send detectors higher up!
- leave astrophysical signals
  - Supernova (SN), BBN, CMB...
- be part of more complex dark sectors
  - with interesting collider / cosmological signatures, as dark sector particles could be produced as part of particle jets!











#### Collaborations

### Strong dark interactions $\Rightarrow$ non-standard collider jets



Inspired by K. Pedro & C. Fallon's talk @ DMLHC2019 and by this twitter thread



Going beyond the "low-hanging fruit":

- Dark sector models (some including DM candidates) with much uncovered territory
   Class of models including dark quarks that fragment in a QCD-like way (dark QCD):
  - **Dark dijets** → prompt dark sector jet constituents
  - **Emerging jets**  $\rightarrow$  long-lived jet constituents
  - Semi-visible jets → invisible jet constituents
- Current searches searching for signals >~ TeV (limited by trigger rates)

SnowMass2021

**Discussions every ~3 weeks** 

at <u>this indico</u>, hosted by Suchita Kulkarni Marie-Helene Genest

#### A family of signatures, with DM particles (& more) in the dark shower ⇒ need more than simple real-time analysis!

Can be searched for in LHCb, ATLAS and CMS [arXiv:1810.10069]

Lunds





### Extending DMWG models to lower masses / couplings

# Can LHC invisible particle searches be interpreted in terms of arbitrarily low DM masses (/couplings)?

 In principle one *could* extend those plots to m<sub>DM</sub> < 1 GeV</li>



- Are there **theory/nuclear physics issues** in the translation of results?
- Personal feeling (from a collider person!) is that couplings of order 1 will paint a misleading picture if we do so, even if we have all caveats specified on the plot



 Wherever this is done, it's not easy to understand how to (re)interpret the y axis & understand full model details for non-theorists (see yesterday's dark photon discussion during Maurik Holtrop's talk)



### Extending DMWG models to lower masses / couplings

#### How do generic LHC searches "move on" from benchmarks with couplings of order 1?

(which still have a lot of merit as collider benchmarks)

- Technical "issue": production of new simulated signal samples is a big overhead for "small" LHC analyses → inertia from moving on from previous recommendations
- Solution: analytical methods being developed within ATLAS/CMS/ Snowmass (K. Pachal, A. Albert, B. Gao, E. Corrigan) - <u>Letter of Intent</u>



• Even with analytical methods, filling the low-mDM parameter space requires more samples

- rc MANCHESTER 1824 The University of Manchester
- Aim to extend vector/axial vector mediator plots for future colliders with more points at lower mediator/DM masses

# Data compression

Collaborations

### As ATLAS physicists, we also like high accuracy...



#### ATLAS DETECTOR AND PHYSICS PERFORMANCE



#### **Technical Design Report**

Issue: Revision: Reference: Created: Last modified Prepared By:

0 ATLAS TDR 14, CERN/LHCC 99-14 25 May 1999 25 May 1999 ATLAS Collaboration

ATLAS detector and physics performance Technical Design Report Volume I 25 May 1999

#### Preface

The Large Hadron Collider opens a new frontier in particle physics due to its higher collision energy and luminosity compared to the existing accelerators. The guiding principle in optimising the ATLAS experiment has been maximising the discovery potential for new physics such as Higgs bosons and supersymmetric particles, while keeping the capability of high-accuracy measurements of known objects such as heavy quarks and gauge bosons.

- *Lossless compression* is a much easier choice to make with respect to *lossy compression*
- However there are use cases where trade-off between more data and less information/precision is worth it
  - Example: searches where not enough collision events containing signal can be recorded because background exhausts storage resources
- We also have to take into account the time and resources needed to compress/decompress, especially within a resource-constrained trigger system







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#### DM Complementarity

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### Data tiers and needs in ATLAS

J. Elmsheuser's talk at CERN/Google TIM (2020)



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- Total ATLAS available disk:
   o(300) PB (similar amounts of tape)
  - Distributed on the Worldwide LHC Computing Grid
  - Also limiting factor to recording more data: disk on CERN site
- Assuming we can't just
   "buy more disk"...
- Lossless compression already used so far in ROOT formats
  - Overview from 2019: <u>arXiv:1906.04624</u>
  - For future perspectives, see e.g. <u>this ACAT 2021 talk</u>
  - Lossy compression (e.g. float truncation) could also help!
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# Compression in the ATLAS trigger, now

Thanks to Wainer Vandelli, Werner Wiedenmann and Oxana Smirnova for discussions



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J. Elmsheuser's talk at CERN/Google TIM (2020)

- RAW data ⇔ "Fragments" of information from each subdetector are compressed in trigger CPU nodes using fast, lossless compression (*zlib* level 1)
- Not necessarily for final storage...but because data needs to be *sent to* storage at high rate with **limited network** bandwidth!
  - This also contributes to limitations on recording more data

## Compression with ML: deep autoencoders



- Effort started in 2019 from a chat with Lukas Heinrich at the <u>HEP Software Foundation Workshop</u>
  - Also some discussion in LHCb (see this <u>GitHub repo</u> and <u>talk</u>)
- 5 undergraduate theses [1][2][3][4], 2 Google Summer of Code studentships [5][6] and 1 IRIS-HEP fellowship later [7]...this looks promising for data from colliders and other fields
  - getting everything ready for demonstrator + publication
    - $\rightarrow$  see Alexander Ekman's talk in the next slot











Introduction DM@LHC Data for DM searches DM@LHC, in context Synergies

#### Real-time analysis, in the CMS trigger



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## The ATLAS Run-2 trigger system





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Introduction DM@LHC Data for DM searches

DM@LHC, in context

Synergies

# The ATLAS Run-3 trigger system





#### Where are the limitations to record (more) data?







#### Topics deferred to HL-LHC and future experiments...

[some ideas from the <u>Snowmass Instrumentation Frontier</u>]

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#### L1Calo for electrons and photons: *eFEX* ATL-DAQ-SLIDE-2020-310



- More granular input for electron and photon identification in Run-3
  - Can be used for more sophisticated algorithms



- Much "steeper" turn-ons for Run-3
  - Improves the rate of useful events
- Trigger rate depends on threshold
  - Run-3 L1 21 GeV threshold leads to same event rate as 24 GeV Run-2 L1 threshold
  - ET>28 GeV has half the rate as ET>28 GeV



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# L1Calo for jets, MET and taus: *jFEX*

ATL-DAQ-SLIDE-2020-135





- Used to trigger on jets, MET and hadronic taus
  - Inputs: calorimeter towers
- Improvements with respect to Run-2: more refined algorithms, e.g.
  - square jets (Run-2) →rounder jets (Run-3)



- improved pile-up mitigation
  - use custom noise thresholds on inputs
  - MET calculated after average energy subtraction







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#### L1Calo for large-R jets and MET: gFEX



- Inputs to the board: coarse towers from **entire calorimeter** 
  - Ideal for large-R jet identification



 Full-scan algorithms can be used for event-level quantities (e.g. pile-up density)



Boosted top simulation



More efficient triggering on large-R jets-with-subjets (with gFEX) than Run-2 (standard square jets)

## Muon triggers and the New Small Wheels (NSW)



- Significant trigger rate from endcap muon detector
- Replace forward muon detectors with improved New Small Wheels
- NSW playing significant role in Run-3 triggers

#### Better identification of "real" low-pT muons using coincidences <u>L1MuonTriggerPublicResults</u>









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# L1 trigger combinations: L1Topo

ropean Research Counci blished by the European Commission



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Example of Run-3 improvement: UChicago-led gFEX board



Inputs to the board: coarse towers from entire calorimeter
Ideal for large-R jet identification



• Full-scan algorithms can be used for event-level quantities (e.g. pile-up density)

**Synergies** 

Collaborations

2034

Year

## Where are the limitations to record (more) data?





Collaborations

# Where are the limitations to record (more) data?



Only **moderate improvement** in price/performance evolution of CPU and disk servers







# Pile-up (and tracking)



Trigger and data acquisition systems are designed to be as robust as possible to increased pile-up



How to meet the pile-up challenge:

#### Software tracking

- Challenge: computationally expensive FTK paper: <u>arXiv:2101.05078</u> accepted by JINST

#### Detector timing

- Challenge: precision / simulation
- (Not covered in this talk)



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# Design and optimization of software tracking

ATL-COM-DAQ-2020-104



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& non-standard workflows

reconstruction of HLT objects (including long-lived signatures)

**Synergies** 

Introduction DM@LHC

DM@LHC, in context

Synergies

#### Further improvements: machine learning

ATL-COM-DAQ-2021-003

CPU time grows linearly with the number of tracking seeds (due to combinatorics) → reduce the number of fake seeds as soon as possible



For use in the trigger: trained predictor implemented in Look Up Tables (LUT) erc

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90

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# Where are the limitations to record (more) data?



In this talk I'll focus on data compression from the HLT onwards







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## What is needed to operate the Run-3 trigger

#### Designing, implementing, operating...

#### ...and monitoring





2015 93.07 2016 pp @ 13 TeV 98.33 100.00  $33 \text{ fb}^{-1}$  $44 \text{ fb}^{-1}$ 2017 pp @ 13 TeV 99.95 99.96 95.67 97.46  $59 \, {\rm fb}^{-1}$ 2018 pp @ 13 TeV 99.99 99.99 139 fb<sup>-1</sup> 2015-2018 pp @ 13 TeV 99.57 99.94 95.60

arXiv:2007.12539, submitted to JINST

Run-3 temptation: "I'll get a hobby until we collect the entire dataset" In order to make the most of the Run-3 data, we need to make sure we dedicate enough experimentalist's time & funding & career prospects to technical / performance work

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# The ATLAS trigger menu in Run-2

#### Trigger menu decided in advance of data taking period: example for 2018

Trigger	Typical offline selection	Trigger Selection		L1 Peak	HLT Peak
		L1 [GeV]	HLT [GeV]	Rate [kHz] L=2.0×10 <sup>3</sup>	Rate [Hz] $4 \text{ cm}^{-2}\text{s}^{-1}$
Single leptons	Single isolated $\mu$ , $p_{\rm T} > 27 \text{ GeV}$	20	26 (i)	16	218
	Single isolated tight $e, p_{\rm T} > 27 \text{ GeV}$	22 (i)	26 (i)	31	195
	Single $\mu$ , $p_{\rm T} > 52 \text{ GeV}$	20	50	16	70
	Single $e, p_{\rm T} > 61  {\rm GeV}$	22 (i)	60	28	20
	Single $\tau$ , $p_{\rm T} > 170  {\rm GeV}$	100	160	1.4	42
Single photon	One loose $\gamma$ , $p_{\rm T} > 145 { m GeV}$	24 (i)	140	24	47
Single jet	Jet ( $R = 0.4$ ), $p_{\rm T} > 435 {\rm GeV}$	100	420	3.7	35
	Jet $(R = 1.0), p_{\rm T} > 480 {\rm GeV}$	111 (topo: $R = 1.0$ )	460	2.6	42
	Jet ( $R = 1.0$ ), $p_T > 450$ GeV, $m_{jet} > 45$ GeV	111 (topo: $R = 1.0$ )	$420, m_{jet} > 35$	2.6	36

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- More or less flexible to adjustments (changes need very good reasons!)

- Follows priorities dictated by experiment's physics strategy
- Algorithms for object identification/selection also make use of machine learning



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## There will be new triggers...

All graphics from H. Russell's slides, HEP Software Foundation Trigger & Reco WG, 2019





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# Overcoming storage (and CPU) bottlenecks



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#### Run-3 plans: extend to physics objects beyond jets

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#### More with less: Partial Event Building (=Selective persistency)

Real-time analysis is necessary for searches

that would otherwise have been impossible due to trigger constraints

<u>Traditional offline analysis still required</u> for a number of searches/final states where all raw information is needed (but we could do better)

Partial Event Building / Selective Persistency as a middle way:

save raw data && trigger objects only in the regions of interest, re-reconstruct later



- keep trigger objects + "on-demand" raw and/or reco in selected regions (< 200 kB)</li>
- keep everything (200 kB)

HSF Trigger & Reco / Institut Pascal discussion, July 2016: <u>https://indico.cern.ch/event/835074/</u>





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H. Russell, EPS-HEP 2019,

Real-time analysis

Dark matter

Collaborations

#### Link to data selection: exotic dark jets & other signatures

Mapping of "exotic" signatures to big picture of theoretical models not easy → difficult to prioritize on theory grounds

 $\rightarrow$  difficult to decide what exactly to save and select, in advance

Example: group of signatures with a **common denominator**: unusual tracks/energy distributions, more or less localized in the detector, e.g. **dark QCD** jets

#### How do we make sure we don't miss these events?

- 1. write dedicated trigger algorithms
- 2. save (custom-reconstructed) trigger-level objects only
- 4. save any of the above and reconstruct data later
- 5. [outlier detection...in the very far future]

Stay tuned for ATLAS/CMS upcoming search results!

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H. Russell, EPS-HEP 2019



#### Partial event building

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# More, later: delayed streams (= data parking)

If **offline CPU availability** is the bottleneck to recording more data: **delay data reconstruction** until LHC ends taking data and the (Tier-0) farm is free

*Run-1:* delayed stream (HT>500 GeV) brought large advantages for hadronic searches

- Dijet resonances (as a precursor to TLA): <u>arXiv:1407.1376</u>
  - RPV stops (with b-tagging): arXiv:1601.07453
  - Also used for 2012 jet energy scale derivation

*Run-2:* also available as "safety net" in case Trigger Level Analysis saw events

• A public answer to yesterday's questions about RK is in the next slide

Run-3: plans to expand use of delayed stream





## More, later: delayed streams (= data parking)

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depending on their primary use case and their specific offline reconstruction needs. Figure 1 shows the average recording rate of the physics data stream of all ATLAS *pp* runs taken in 2018. Events for physics analyses are recorded at an average rate of ~ 1.2 kHz.<sup>2</sup> This comprises two streams, one dedicated to *B*-physics and light states (BLS) data, which averaged 200 Hz, and one for main physics data, which averaged 1 kHz. The BLS data are kept separate so the offline reconstruction can be delayed if available resources for offline processing are scarce due to high LHC uptime.



Figure 1: The average recording rate of the main physics data stream and the *B*-physics and light states data stream for each ATLAS *pp* physics run taken in 2018. The total average of all runs is indicated as a red dash-dotted line, and the total average of the main physics stream is indicated as a blue dashed line.





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# iDMEu, the Dark Matter Test Science Project and the HEP Software Foundation

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#### Two complementary projects (everyone is welcome!)



#### in a common Software Catalogue and

as input to the design of the

**European Open Science Cloud** 

### More about iDMEu (following yesterday's discussion)

#### **iDMEu** initiative for Dark Matter

#### in Europe and beyond

The best region to find dark matter is the one where more techniques and ideas can **discover** and **explore** DM!



After the European Strategy Update process and during a joint ECFA/APPEC/NuPECC (JENAA) meeting, a number of DM researchers met with similar questions:

*E.g. "what are your assumptions?" "why do you use this technique?" "how will findings in your DM research impact my DM research?" "where can we meet and discuss this topic in depth after this meeting?"* 

iDMEu kick-off - 2021/05/10-12 https://indico.cern.ch/e/iDMEu

#### The JENAA iDMEu LOI proponents:

Elena Cuoco Marco Cirelli Caterina Doglioni Gaia Lanfranchi Jocelyn Rebecca Monroe Silvia Pascoli Federica Petricca Florian Reindl

We realized that there was **no common platform** for these discussions or for resource sharing → we decided to start developing it, with three interconnected objectives









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### More about iDMEu (following yesterday's discussion)

#### Three connected **iDMEu objectives**

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**Note:** iDMEu is intended as a platform that brings together **existing/future** community efforts

iDMEu enables finding **synergies** and highlighting the **complementarity** of different dark matter communities by developing a **common platform** to:



Link to kick-off meeting (with recordings)

Mailing list: will be communicated to endorsers/kick-off meeting participants in the cert few days -> if you'd like to stay informed, enter your details <u>here</u>



Collaborations

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#### More about the Dark Matter Test Science Project in EOSC-Future

- Implement open and reproducible end-to-end analysis workflows on a common infrastructure
- Using ESCAPE services, see <u>https://projectescape.eu</u>, to serve as stepping stone for European Open Science Cloud
- DM Test Science Project (TSP): take 5 use cases included in ESCAPE
   –> 5 postdoc positions funded by INFRAEOSC-03 open <u>here</u>

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• Another parallel TSP for Extreme Universe (focused around gravitational waves)







#### Where to discuss trigger&reconstruction in HEP & beyond

#### HSF = High Energy Physics (HEP) Software Foundation

- Forum for physicists with interest in software for HEP
  - ...and beyond: contacts and shared meetings with nuclear physics, accelerator, DM experiments
- Latest <u>whitepaper</u> on common software and techniques
  - Initial whitepapers helped shape <u>IRIS-HEP</u> US/NSF effort
- Working groups including <u>trigger & reconstruction</u>
  - Trigger & reconstruction <u>plans</u> for 2021 include ML for hardware triggers, heterogeneous architectures



HEP Software Foundation

Website Discussion Forums





Synergies between MAchine learning, Real Time analysis and Hybrid architectures for efficient Event Processing and decision making SMARTHEP



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#### [Starting 10/21] SMARTHEP = European Training Network on real-time analysis, machine learning and hybrid architectures

- "Too much data" is not only a high energy physics problem
- Time-to-insight also the key metric for industry (= finance, self-driving cars, industrial maintenance...)
- <u>Shared supervision</u>: 12 students from LHC experiments + Computer Science + Industry, tackling the problem of <u>efficient decision-making</u>
- <u>Shared Tools:</u> Hardware (FPGA, GPU) & software, machine learning

Similar collaborations exist in the US,

eg. https://fastmachinelearning.org, https://clariphy.org