RDC5 WP Proposal: Large AI/ML Physics Models for Advanced Triggers

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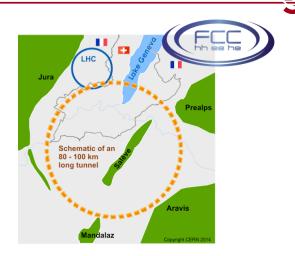




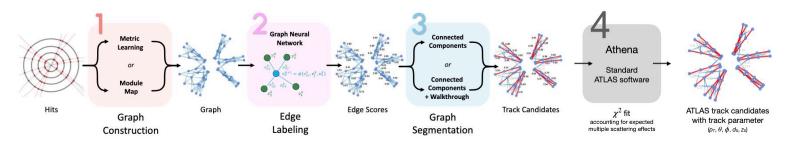
NATIONAL ACCELERATOR LABORATORY

Motivation

- Advanced trigger systems at future colliders will have to handle unique data processing needs
 - Ex. FCC-ee: potentially trigger-less readout at high precision; inference at-source/on-detector
 - Ex. FCC-hh: exascale data rates, µ~1000 compression/reduction)



- "Large physics models" (LPMs): take advantage of high-dimensional models over lots of low-level detector input
 - Ex. ATLAS GNN4ITk, ultra-fast transformers
 - Some problems of implementation for future colliders are not solved, particularly considering latency/resource restrictions

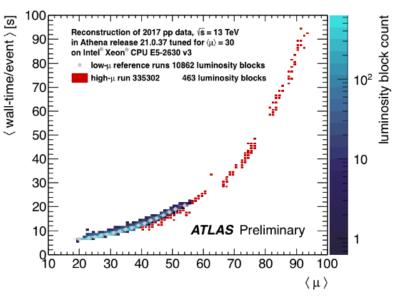


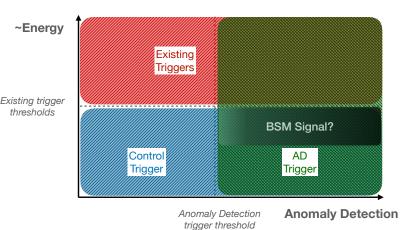
LPMs in TDAQ: Work Package Objectives

1. Maintaining performance in future collider environments

- First ATLAS use case: studying SNL-based FGPA implementation of GNN4ITk interaction network (edge classification with ~10⁵ nodes and 10⁶ edges)
- How does this scale to very high occupancy environments? (µC, FCChh)
- 2. Increased/novel BSM sensitivity (eg. advanced <u>anomaly detection triggers</u>)
- 3. Develop new methods for use across physics subfields (eg. photon science):
 - Advanced SLAC Neural network language (<u>SNL</u>) as alternative hls tool (with dynamically loading weights)

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Summary

SLAC

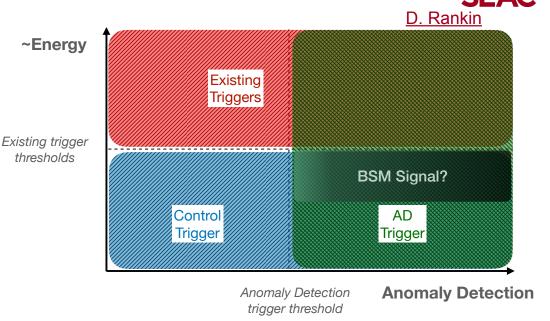
- Context:
 - DRD: 7.1 (tech for increased data density), 7.2 (increased intelligence on the detector)
 - RDC: 4 (intelligent data processing)
 - <u>NextGen</u> trigger @ CERN?
- Collaboration:
 - SLAC ATLAS + Technology Instrumentation Division (TID)
 - Group expertise in FPGA firmware engineering, ATLAS anomaly detection trigger in HLT/L1, AI/ML for HEP
 - Topical interest across national labs + universities
- Happy to be in touch with anyone interested! jgonski@slac.stanford.edu



Backup

Kickoff: AI/ML for Advanced Future TDAQ

- Anomaly detection (AD) triggers: data-driven ML-based algorithms to trigger on unusual/outlier events
 - Agnostic to specific BSM signatures,
 - More "intelligent" algorithm could probe below current trigger thresholds
- CMS has already developed & is doing crate testing of an AD trigger stream in Run 3 [<u>C. Sun</u>]



R&D Ideas/Plans

- 1. Algorithm studies (autoencoders, transformers, graphs, etc...) for software triggers
- 2. High-level synthesis & accelerate model of choice to run in firmware for FPGA-based triggers
- 3. R&D for AD capabilities at ASIC-level: detector signal monitoring/classification of unusual signals