### **DUNE Far Detector Framework Drivers**

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June 6, 2023

#### Overview

Themes

- A view of DUNE far detector (FD) design and its data from offline framework eyes.
- The initial stages of offline processing.
- File-based branching and merging patterns.
- Software build/run/devel ecosystem.
- Effective exploitation of varied mixes of CPU/GPU resources.

DUNE far detector: four detector modules, two subsystems

**Time projection chamber** (TPC) sensitive to ionization electrons TPC is source of the vast majority of the FD data.

- DAQ per-module input data rate:  $\approx 1.5$  TByte/s  $\approx 50$  EB/year.
- Offline total "allowed" input data rate: 30 PByte/year

As much as a  $10^{-4}$  reduction in data volume is required.

**Photon detection system** (PDS) sensitive to scintillation light

Minor portion of data but **essential** for vertex  $t_0/x_0$ , trigger, reco, etc.

Functionally-identical **detector units (DU)** compose each detector module DU examples: Horizontal Drift has 150 APAs, Vertical Drift has 160 CRPs.

# DUNE DAQ Trigger Record (TR)

#### DUNE DAQ trigger and readout

- The DAQ **self-triggers** by considering **all** input data.
- Writes subset of data to file in form of trigger records (TR nee "event").

#### Expected types trigger records

- Localized:  $\mathcal{O}(5 \text{ GByte}), T \approx 3 \text{ ms}, \lambda \approx 0.1 \text{ Hz}$ , may include a subset of DU.
- Extended:  $\mathcal{O}(150 \text{ TByte}), T = 100 \text{s}, \lambda \approx 1/\text{month}, \text{supernovae} \text{ candidate, all DUs.}$

#### DAQ packed files vs Offline working memory sizes

• Need 2 working copies and 14bit  $\rightarrow$  32 bit  $\Rightarrow$  4.5× inflation.

## DAQ file model

Driver: target file sizes in range of 2-10 GB for efficient tape utilization.

#### Localized TRs: **monolith**

- Early running, whole-module readout:  $\mathcal{O}(1)$  TR/file.
- Later, safely decimate TR, nullifying some DUs:  $\mathcal{O}(10)$  TR/file.

#### Extended TRs: sliced monolith

• Time slice single 100 second TR into  $eg \ 2 \times 10^4$  files  $\Rightarrow 5 \text{ ms}, \approx 7 \text{ GB}$  per file.

# Offline processing issues with monolithic file model

Processing of dense ADC arrays faces strong memory pressures.

- **ProtoDUNE-SP**: 6 APA  $\times$  3 ms difficulty hitting 2-4 GB/job.
  - DAQ FD **decimation** leaves  $\approx 15$  DU/TR average.
- One extended TR time slice is full  $\approx 150$  DU/TR, not tenable.

Something new is needed.

## DAQ file loading strategies

Initial processing stages' algorithms require data from only a single DU!

#### **Serial**: iterate over the TR to load **one DU at a time**.

- Requires lazy loading, eager saving and purging of transient data.
- Requires framework hierarchy extension: run / subrun / event / unit
- If achieved, should allow for single-core (2GB) jobs.

#### Parallel: load all DU in TR and allocate large memory.

- Allocate **multiple CPU** cores to provide **sufficient memory**.
- Utilize **multi-thread** processing so as to not waste allocated CPU cores.
- DAQ decimation will lead to variability in jobs size over job lifetimes, must allocate for worse case.
- SBND has demonstrated this approach with art+larsoft+Wire-Cell jobs.

# Initial DUNE processing stages

#### High-level conceptual processing chain:



- Each box is one batch processing campaign stage.
- Bubbles are file sets.
  - ▶ SIM may be combined into TPC1 (and/or PDS1) to if intermediate need not hit files.

# TPC1 processing stage one



#### RAM limits processing to $\mathcal{O}(5 \text{ ms} \cdot \text{DU})$

- localized TRs naturally satisfied, assuming serial/parallel loading strategy.
- extended, sliced TRs additionally require duplicate  $\approx 100 \ \mu s$  at slice boundaries.
  - Needed to avoid introducing FFT related artifacts.
  - Framework must allow a 2-slice buffer inside signal processing to be maintained.

## TPC2 processing stage two



Must branch at the signal-ROI data tier to feed different analysis strategies.

- 2D-first takes signal-ROI as 3 × 2D views (Pandora, etc)
- **3D-first** performs computed tomographic imaging (Wire Cell)

No big framework issues, but downstream merge required.

# TPC3 processing stage three



#### The TPC3 stage **merges** clusters from a TR across all DU.

- Framework must transition from per-DU loading to whole-TPC processing.
- Extended TR: may need to merge both over DU and slices.
  - Or not: SNB interactions are small. Analysis groups need to decide.

# DET1 processing - first whole detector module stage



#### Combine PDS + TPC for **flash matching**.

- Framework must allow synchronized reading of files with different types of data.
- Records may not share common I/O keys, eg due to previous slicing.

## Software ecosystem issues

#### Problems related to binary/UPS-based ecosystem.

- Good support for some OSes, but not all OS used by DUNE collaborators.
- "Challenging" to build the stack on unsupported GNU/Linux OS.

Problems reported with hard-locked versions in software dependencies.

Can not "swap out GENIE versions easily without cutting a new LArSoft release".

#### Migration to Spack

• I expect the move to Spack will solve most of these kind of problems.

Personally, I greatly appreciate the effort put in to this important change.

# DUNE production processing wants to use GPUs

Many spots in DUNE code can be accelerated with GPU. A sampling:

- Wire-Cell TPC sim (18×) and signal processing (currently  $2\times$ )
- GaussHitFinder (10×) and EmTrackMichelId (14×)
- Deep neural network (DNN) inference (typical  $\approx 20\times)$

Ignoring special **DNN training**, the processing is still **CPU dominated**. Full jobs need 5-100 CPU / GPU

- In general, must share GPU with multiple threads/processes/boxes.
- Or accept idle GPU, verboten in some computer facilities.
- Sharing requires some form of **GPU task queuing and scheduling** 
  - Else GPU idles and/or RAM overloads, jobs crash.

# GPU queue schedulers in DUNE

- "GPU as a service" with nVidia Triton Server
- Wire-Cell/ZeroMQ distributed task offload
- Wire-Cell GPU algs with inter-thread semaphore

# Issues shared by current queue schedulers

- All s/w in a job must share a common interface.
  - Circumventing the will lead to GPU overload / out of memory errors.
  - Same time, must reject code lock-in, keep CPU/GPU portability.
  - ► Need an insulating mini-framework.
- Normal usage pattern leads to idle CPU cores
  - Thread/core launches GPU task, waits for response.
  - > Queue depth fluctuates high, many CPU cores go idle. A very dynamic problem.
  - Some mitigation possible (CMSSW "external" and TBB tbb::flow::async\_node)
  - Requires framework, toolkit, user code adherence.
    - \* Need **independent mini-framework** used in different code contexts/packages.

Cross-project task group?

DUNE far detector drives various framework issues including at least:

- file loading at different scales and managing monolithic TRs.
- file-level branch/merge patterns,
- software ecosystem portability/flexibility and
- GPU support given variety of software and hardware deployments.

# $\mathcal{FIN}$

backups

# Monolithic vs striped DAQ files

Current file model: localized monolithic and extended, sliced monolithic.

#### However, it is possible for DAQ to stripe a TR across per-DU files.

- Striped files will simplify requirements on the framework.
- Allow simple, low-memory, single-core jobs.
- Forget hierarchy extension, special DU-iteration, lazy loading, eager write, data purging.
- The extended, TR **slices** are longer (eg 1 s) but then further segmented into **chunks** on reading.
- But, some additional file bookkeeping and data aggregation issues to solve.

We should study if a striped model is preferred over monolithic.