

Software and computing at the CMS experiment

56th Annual Fermilab Users Meeting

Mia Liu (Purdue University) June 28 2023

Outline

Brief intro to CMS trigger and data acquisition system

Role of software and computing in CMS

Status of Current CMS software computing

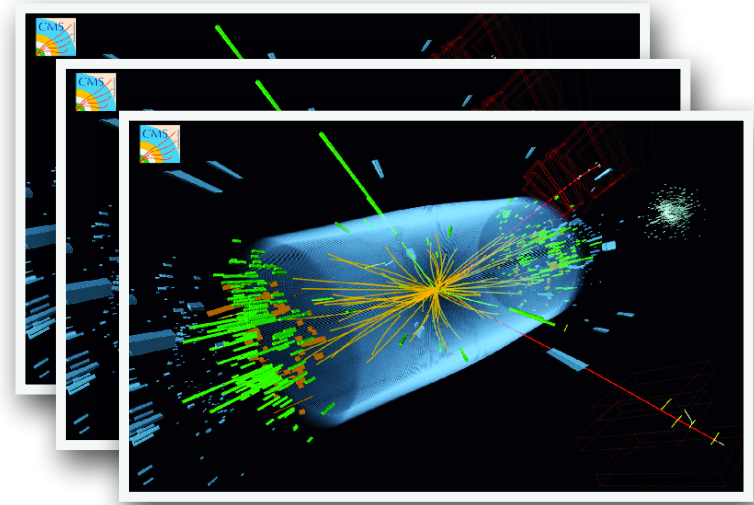
Computing challenges at the High-Luminosity LHC (Run 4) starting in 2029

Collider operation conditions, physics needs and changing computing hardware landscape

R&D Highlights

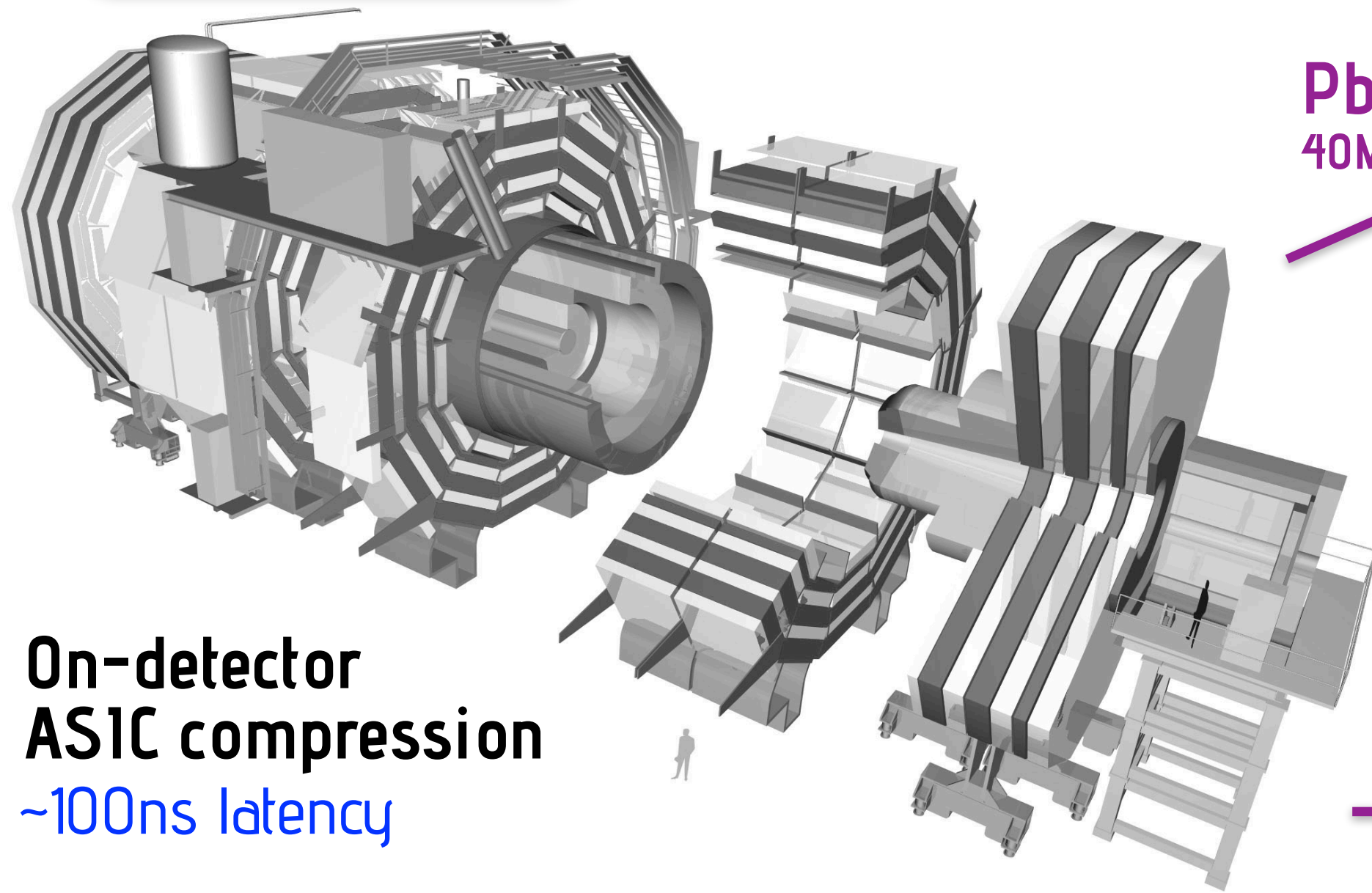
Connection to other science domains and summary

CMS data collection



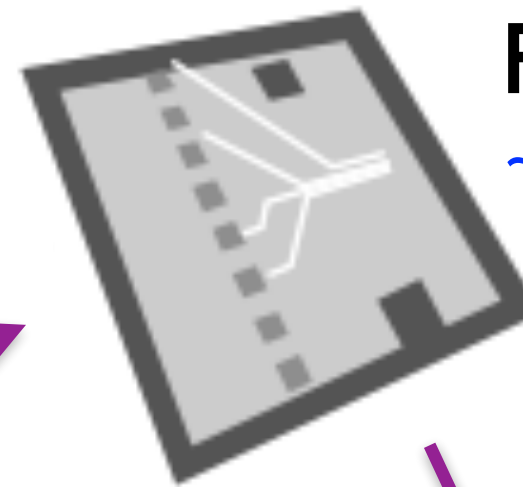
CMS Experiment

40MHz collision rate
~1B detector channels



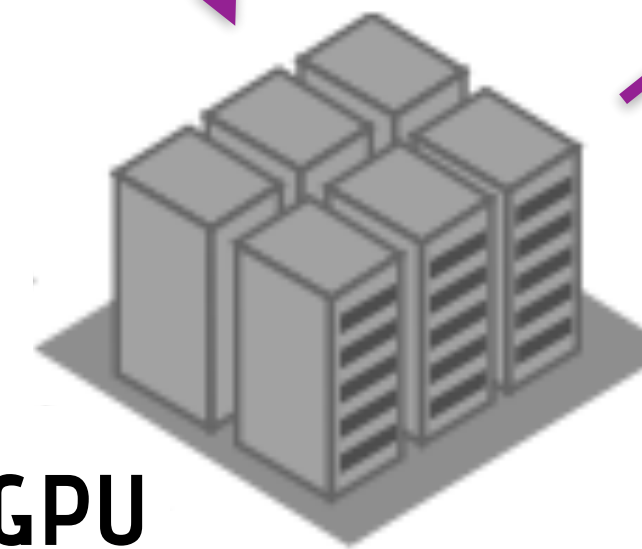
On-detector
ASIC compression
~100ns latency

Pb/s
40MHz



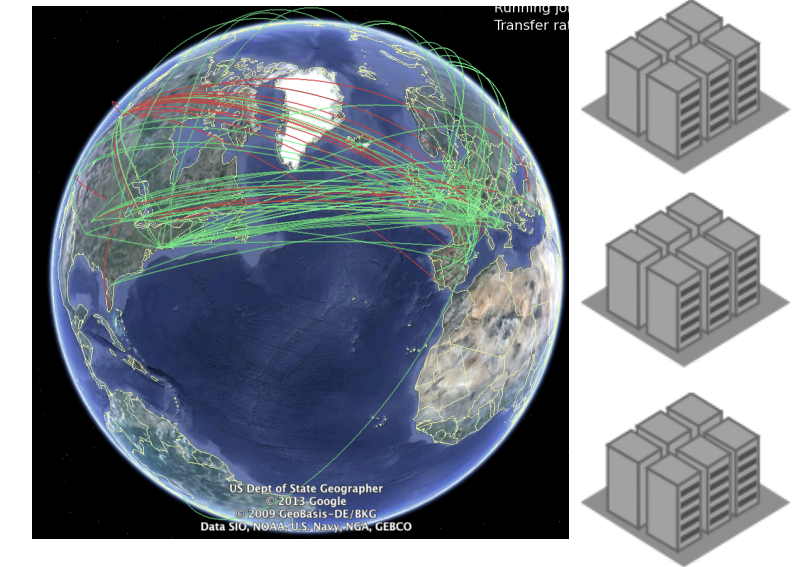
FPGA filter stack
~ μ s latency

10s Tb/s
100s kHz



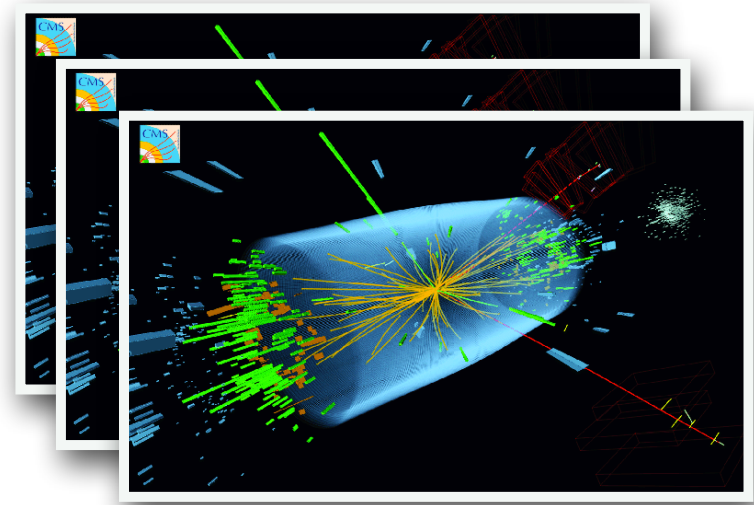
On-prem CPU/GPU
filter farm
~100 ms latency

10s Gb/s
~5 kHz



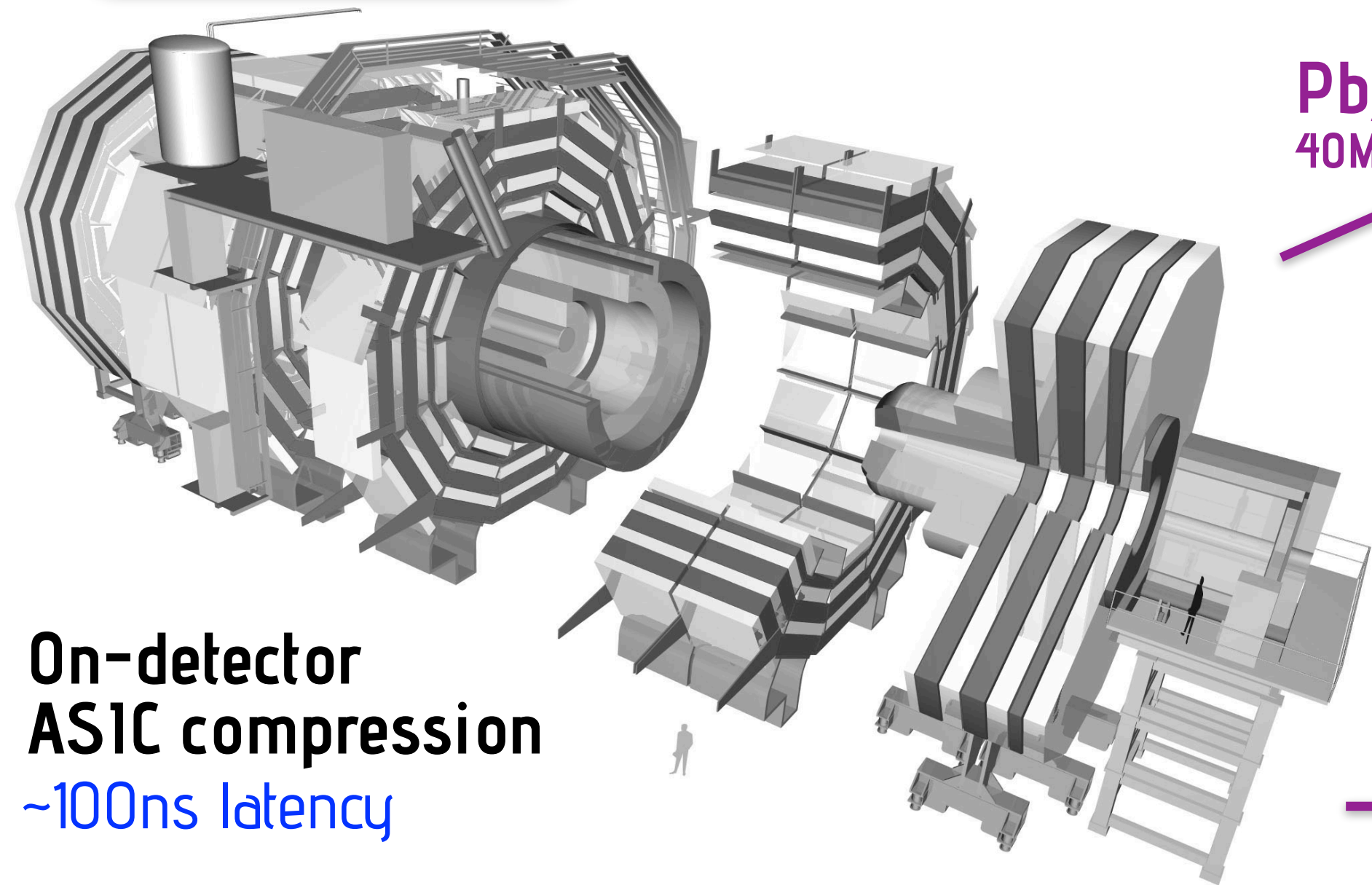
Worldwide
computing grid
Exabyte-scale
datasets

CMS data collection



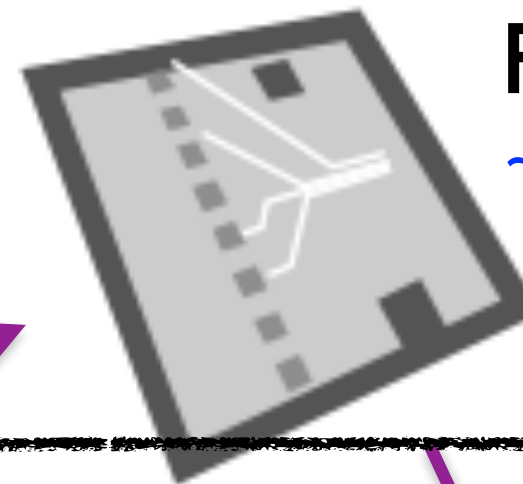
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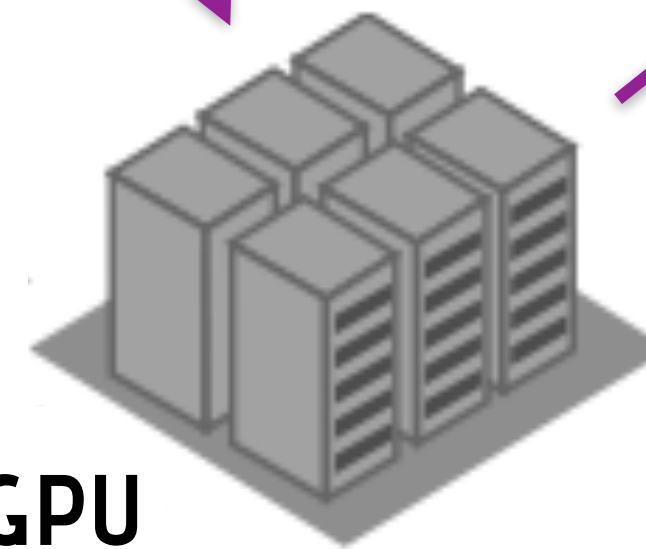
Pb/s
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FPGA filter stack
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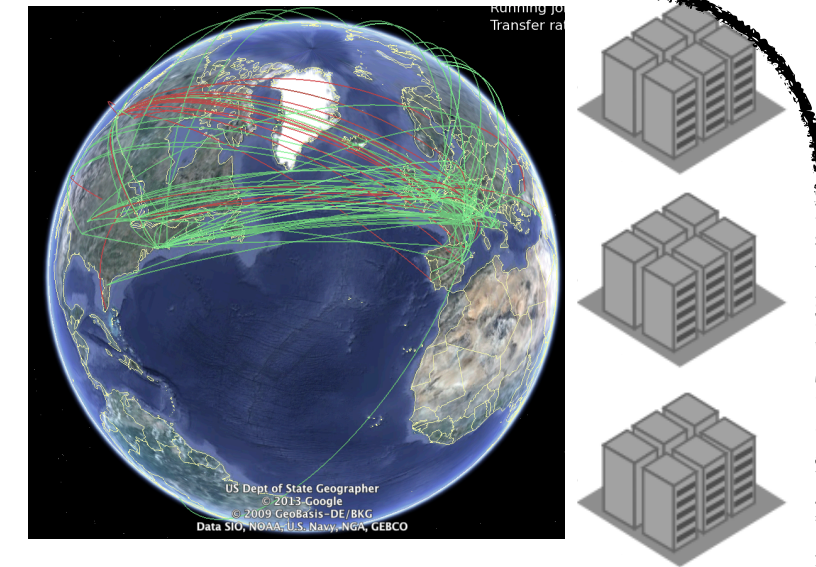
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On-prem CPU/GPU filter farm
~100 ms latency



10s Gb/s
~5 kHz

This talk



Worldwide computing grid
Exabyte-scale datasets

CMS computing and current status

Computing is crucial to CMS physics results

LHC Run 3 data taking is on-going, 2 times luminosity compared to Run 2

Offline distributed high throughput computing infrastructure

1 Tier-1 center at Fermilab. 8 Tier-2 sites in the US

Successfully using HPCs via HEPCloud

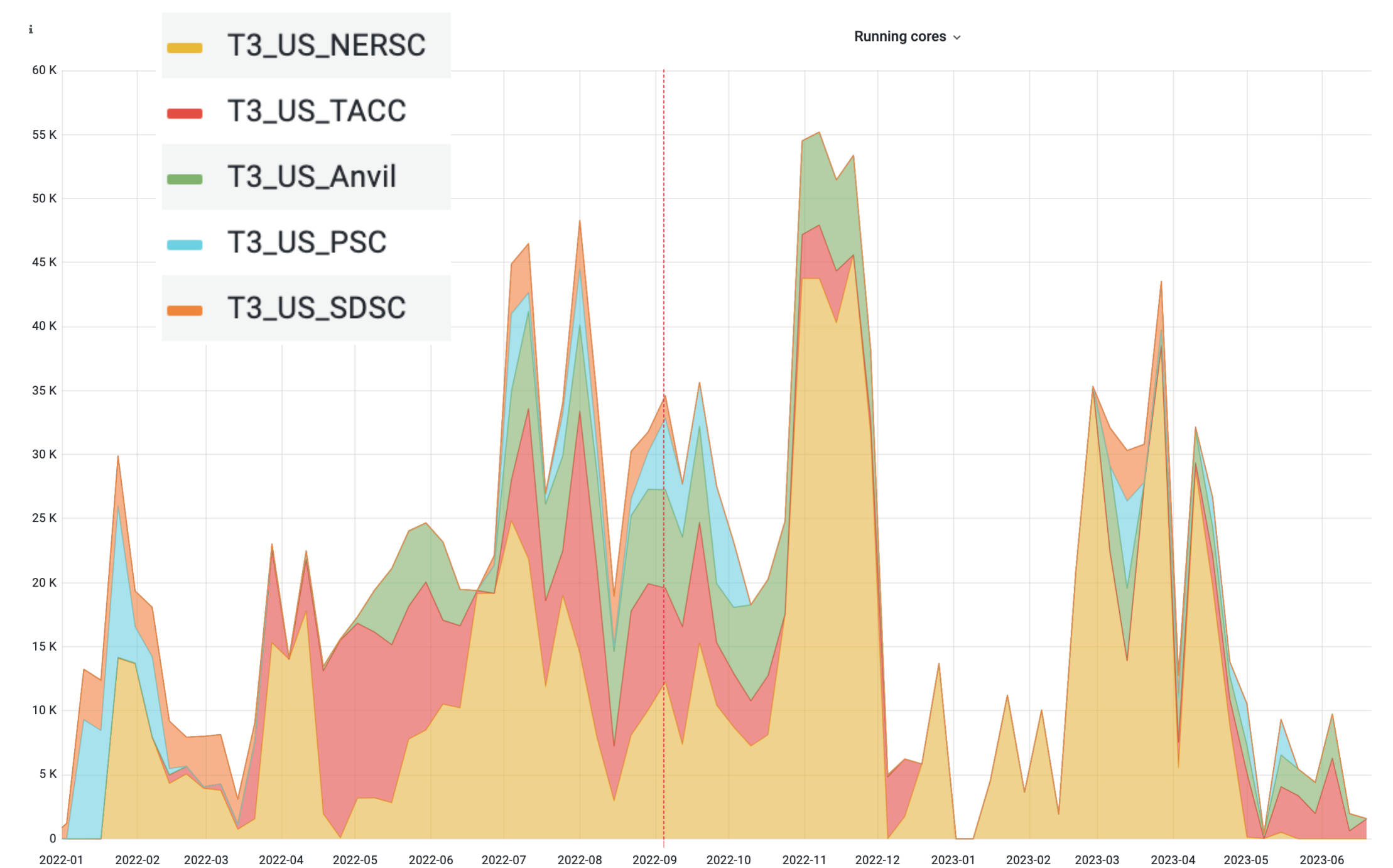
~1 B events produced in 2023. 5% of CMS total

Continue to onboard HPC sites: IACS at Stony Brook Ookami (First ARM HPC for CMS)

GPU running at the HLT in Run 3

Will come back to GPUs (and similar) later

CMS running cores on HPC sites (2022/01- Now)



Computing challenges in CMS at the HL-LHC

Data volume: 10 X more integrated luminosity

Data complexity: 10 X Detector channels ($O(100M)$ - $>O(1B)$)

Trigger rate increases by 10x (to $\sim 10\text{kHz}$)

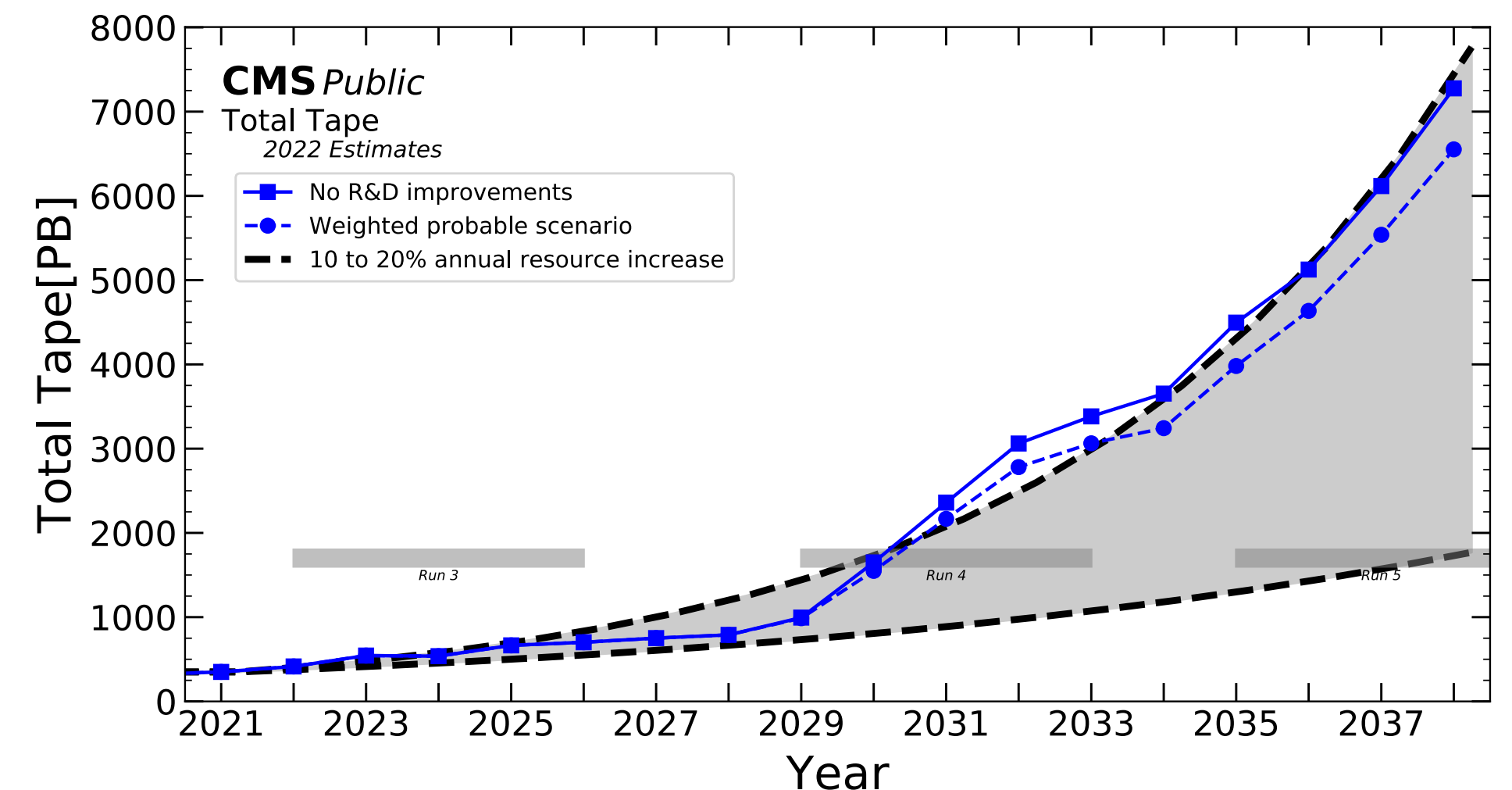
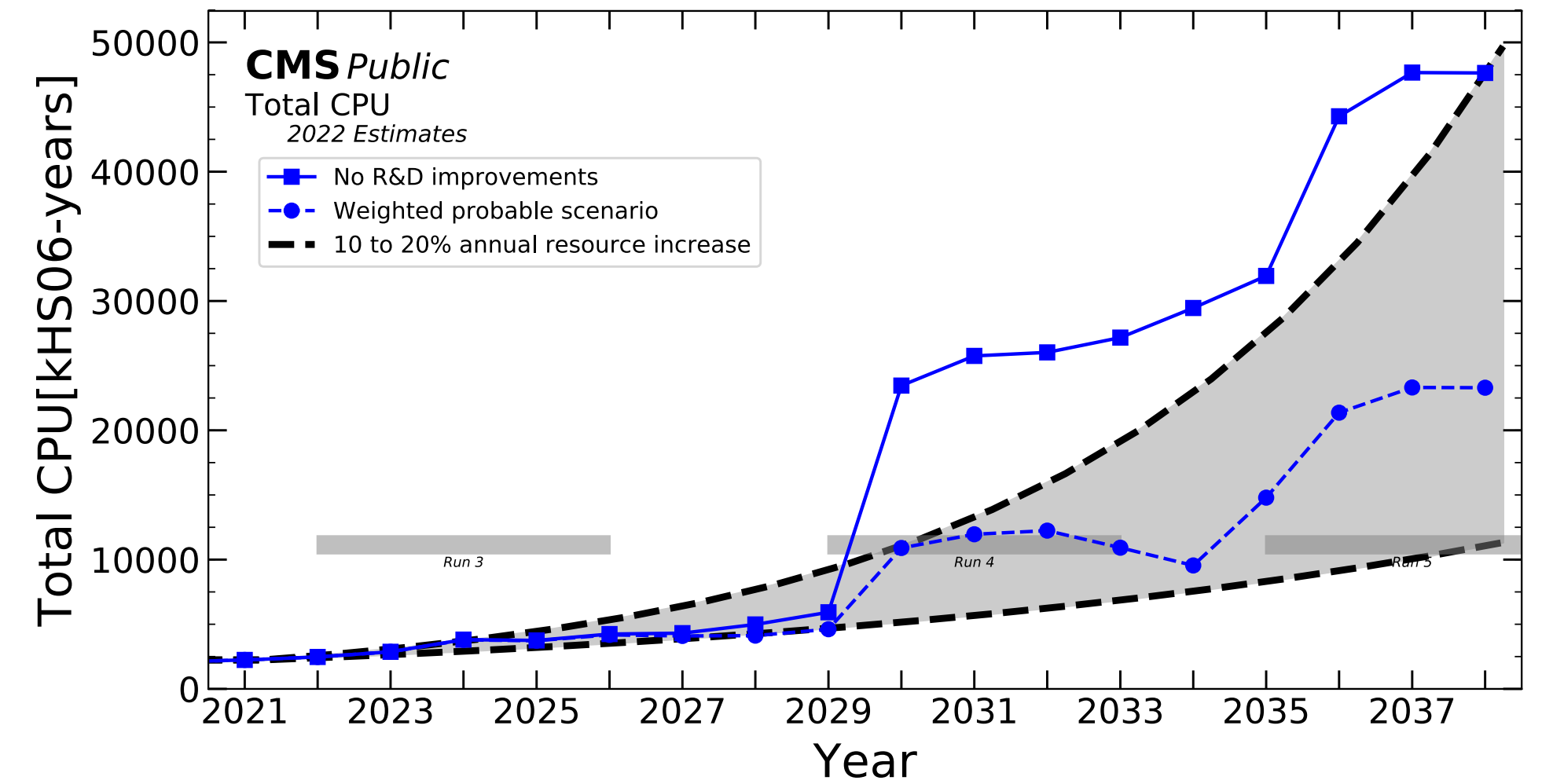
Physics needs

Advanced sophisticated algorithms

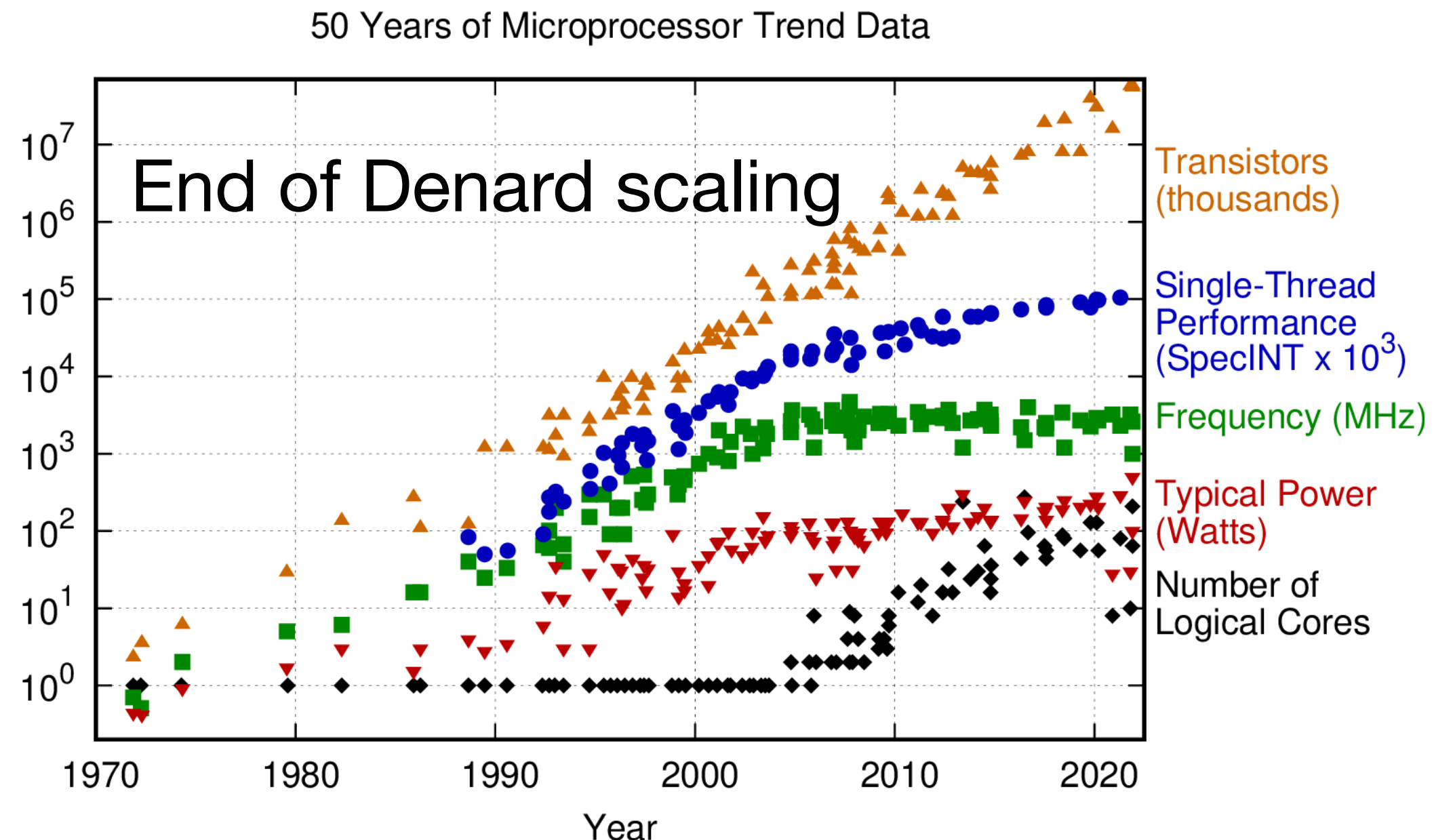
Alternative readout schemes: B-parking (already in Run 3)/L1-scouting

Enhanced MC stats needed for precision measurements

Increased needs in storage, processing power, user analysis support



Changing hardware landscape



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten
New plot and data collected for 2010-2021 by K. Rupp



Proactively adapting to new hardware trends: adopted multi-threaded computing

Crucial to the success of CMS computing

Accelerated heterogeneous compute: Opportunities and challenges

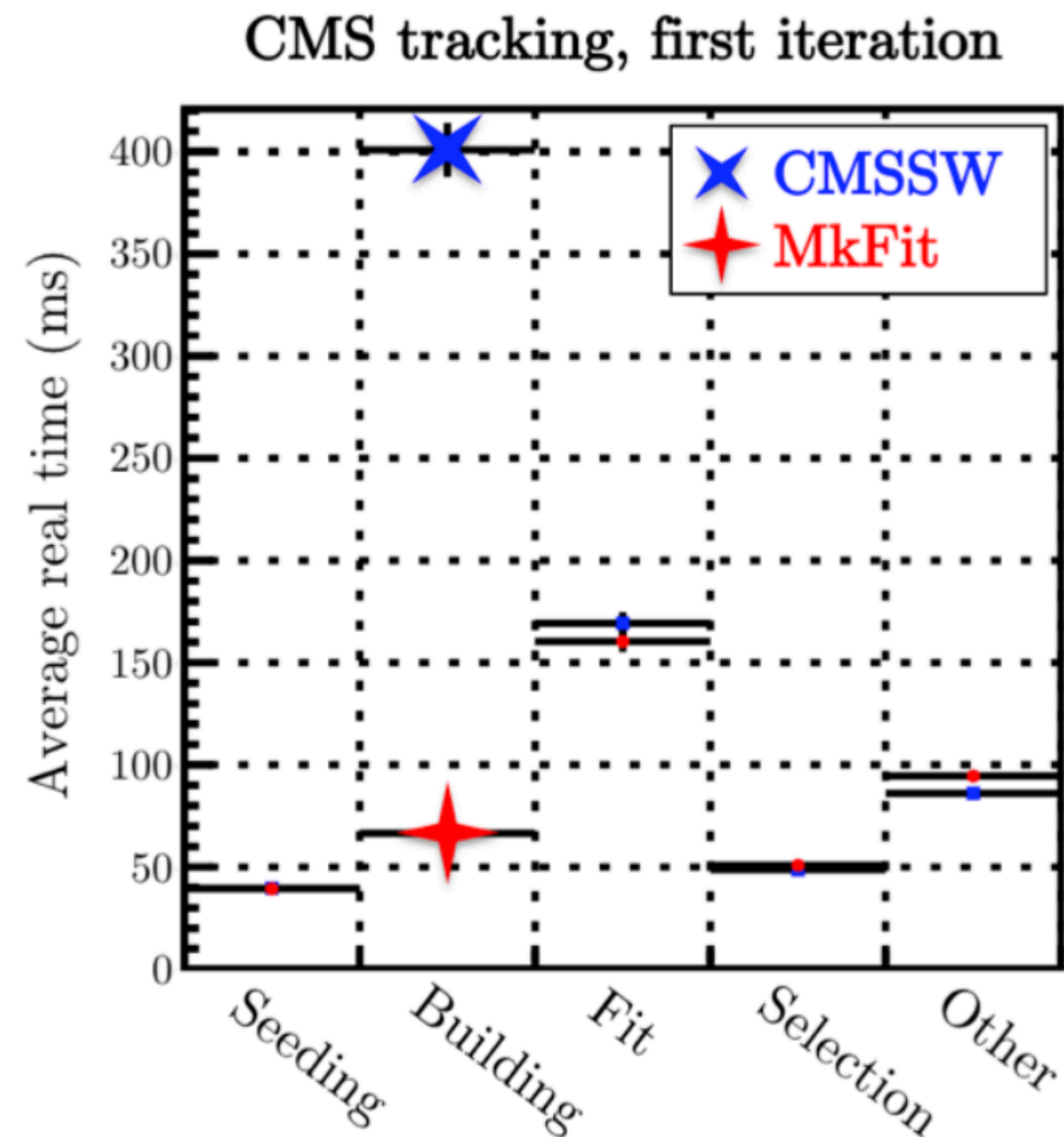
GPU running at the HLT for CMS Run 3 data-taking.

Highlight R&D activities towards HL-LHC, projects led by USCMS/FNAL.

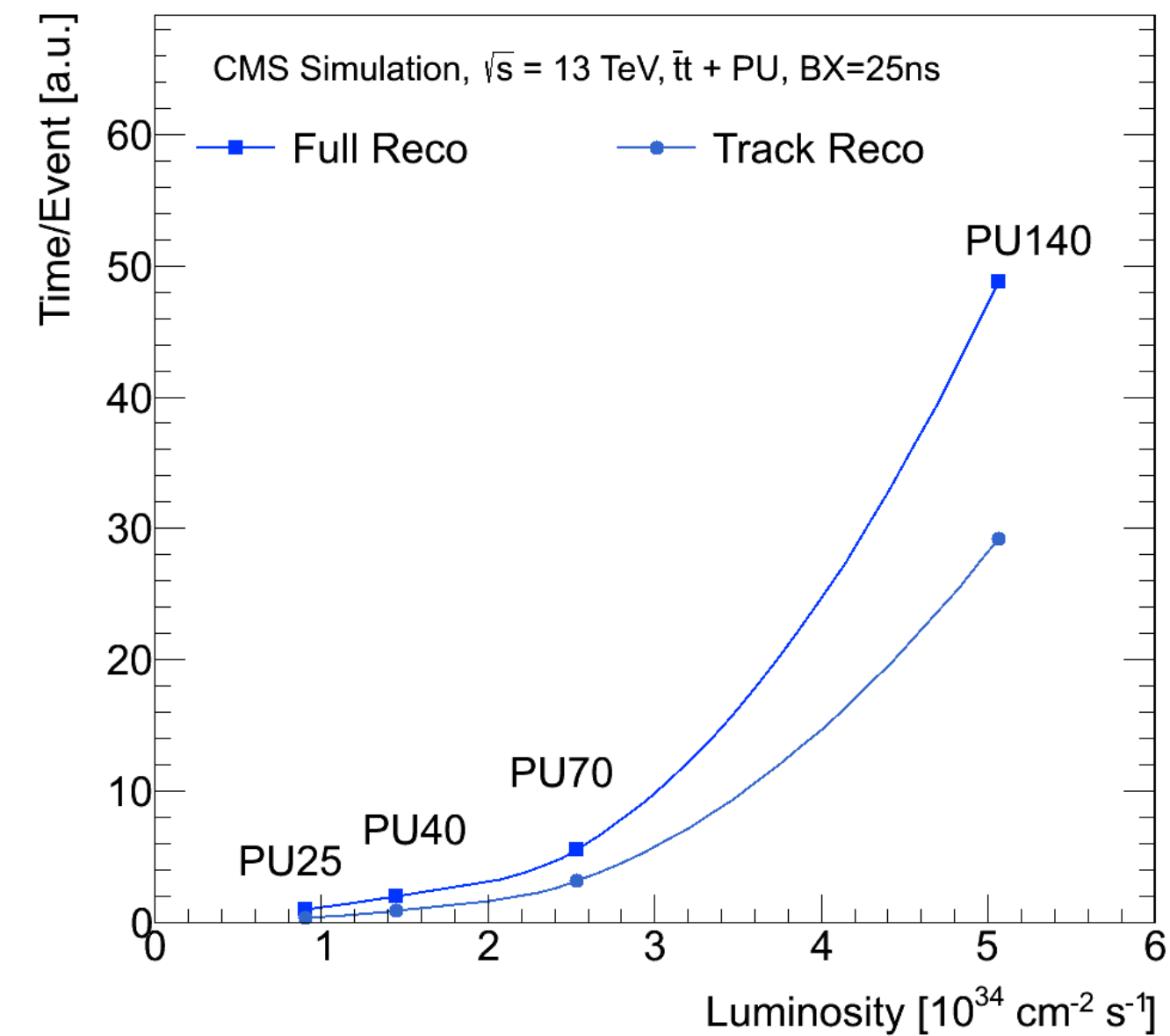
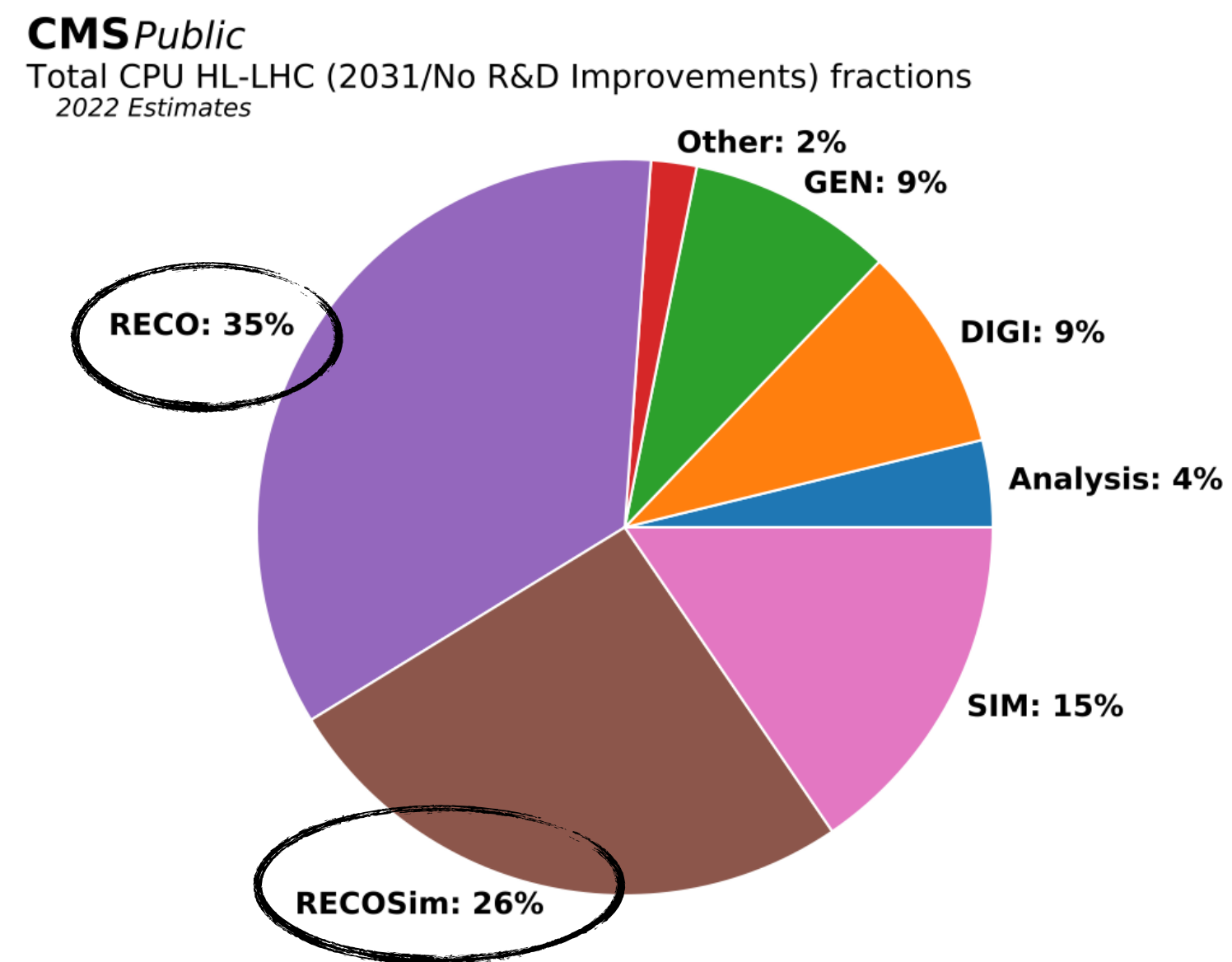
Efficient reconstruction with increased parallelism: mkFit

Track reconstruction is a large part of the CMS reconstruction CPU budget

Increasingly so at higher pileup of HL-LHC
CMS uses a Kalman Filter algorithm for track reconstruction



<https://iris-hep.org/projects/mkfit.html>



Increases parallelization of algorithm and uses vector units in modern CPUs

Track building up to 6x faster compared to standard algorithm

Algorithm now deployed with standard CMS software for Run 3, further development includes optimization for GPUs and other heterogeneous computing.

Heterogenous computing: software portability

Available computing resources (including at HPCs) increasingly non-CPU (e.g. GPUs), each flavor of GPU/accelerator may require difference software

e.g CUDA only works on NVIDIA GPUs.

Portability solutions allow offloading to different GPUs with the same code base

Compiler pragma-based approach/Libraries/Language extension

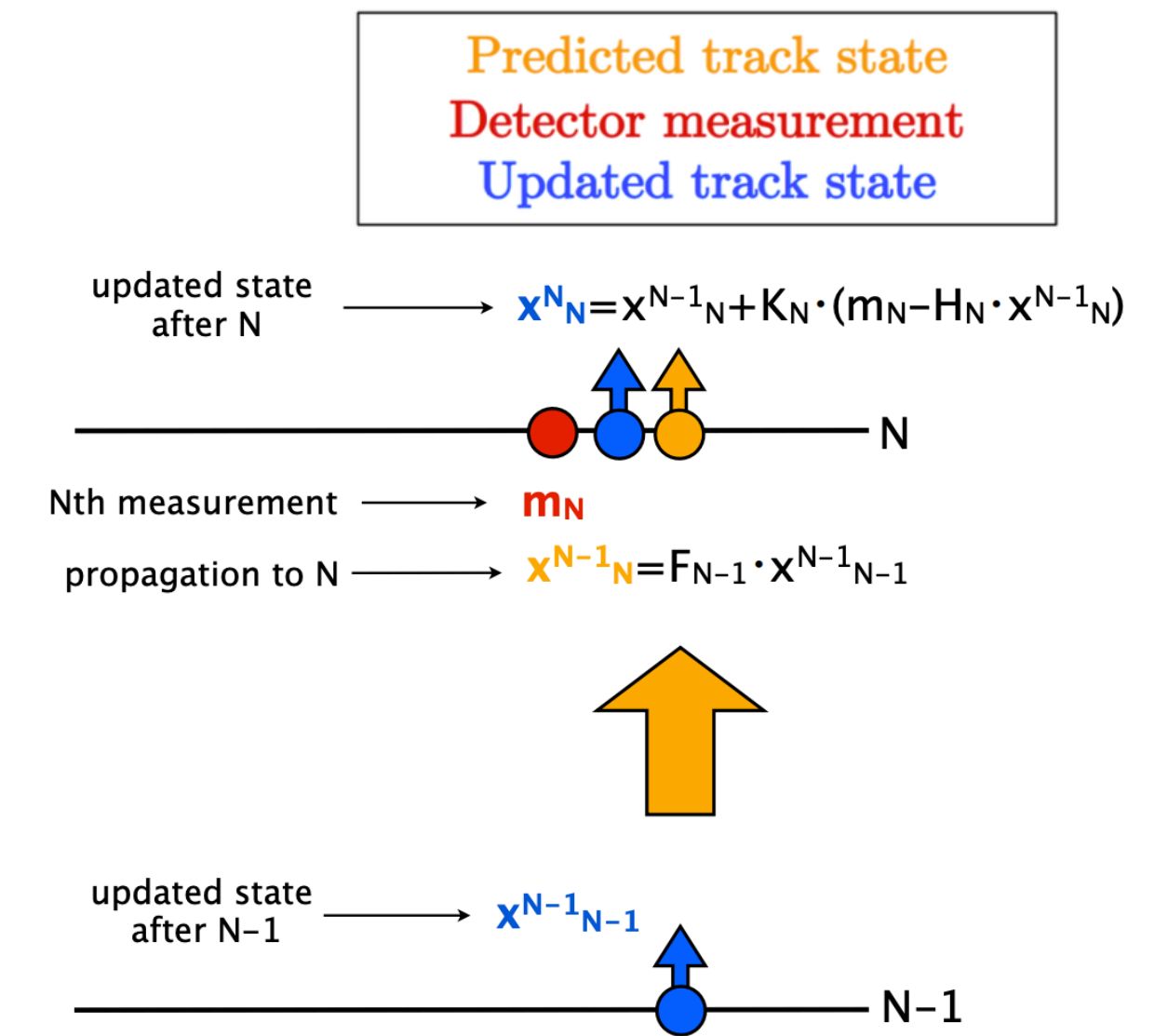
CMS investigated code portability solutions, Alpaka was chosen

New features/compiler supports/new backends

Software →

Hardware ↓

	CUDA	Kokkos	SYCL	HIP	OpenMP	alpaka	std::par
NVIDIA GPU			intel/llvm compute-cpp	hipcc	nvc++ LLVM, Cray GCC, XL		nvc++
AMD GPU			openSYCL intel/llvm	hipcc	AOMP LLVM Cray		
Intel GPU			oneAPI intel/llvm	CHIP-SPV: early prototype	Intel OneAPI compiler	prototype	oneapi::dpl
x86 CPU			oneAPI intel/llvm compute-cpp	via HIP-CPU Runtime	nvc++ LLVM, CCE, GCC, XL		
FPGA				via Xilinx Runtime	prototype compilers (OpenArc, Intel, etc.)	prototytype via SYCL	

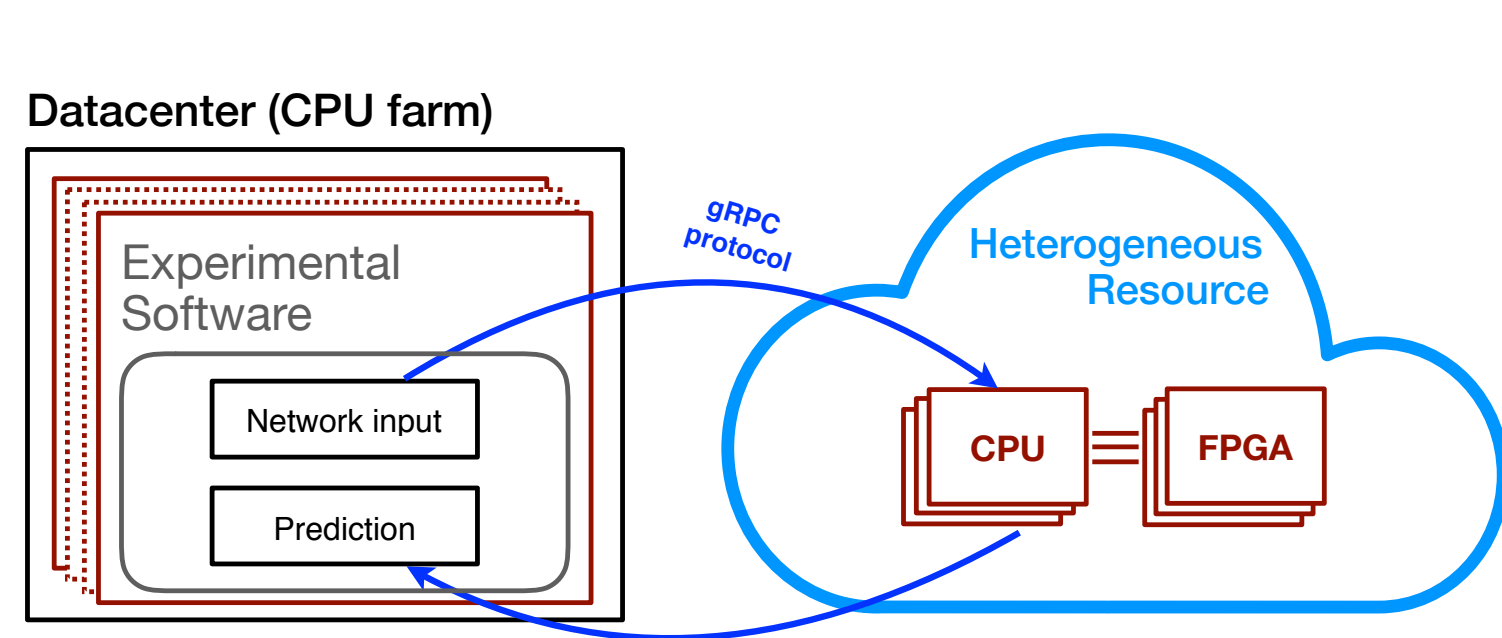


Portability talk at CHEP 2023

Steps of the mkFit core math of parallelized track reconstruction tested on various hardware software combinations.

Heterogenous resources 'as-a-service': SONIC

'Services for Optimized Network Inferece on Co-processors'



Acceleration 'as-a-service'

NVIDIA Triton: ML inference server

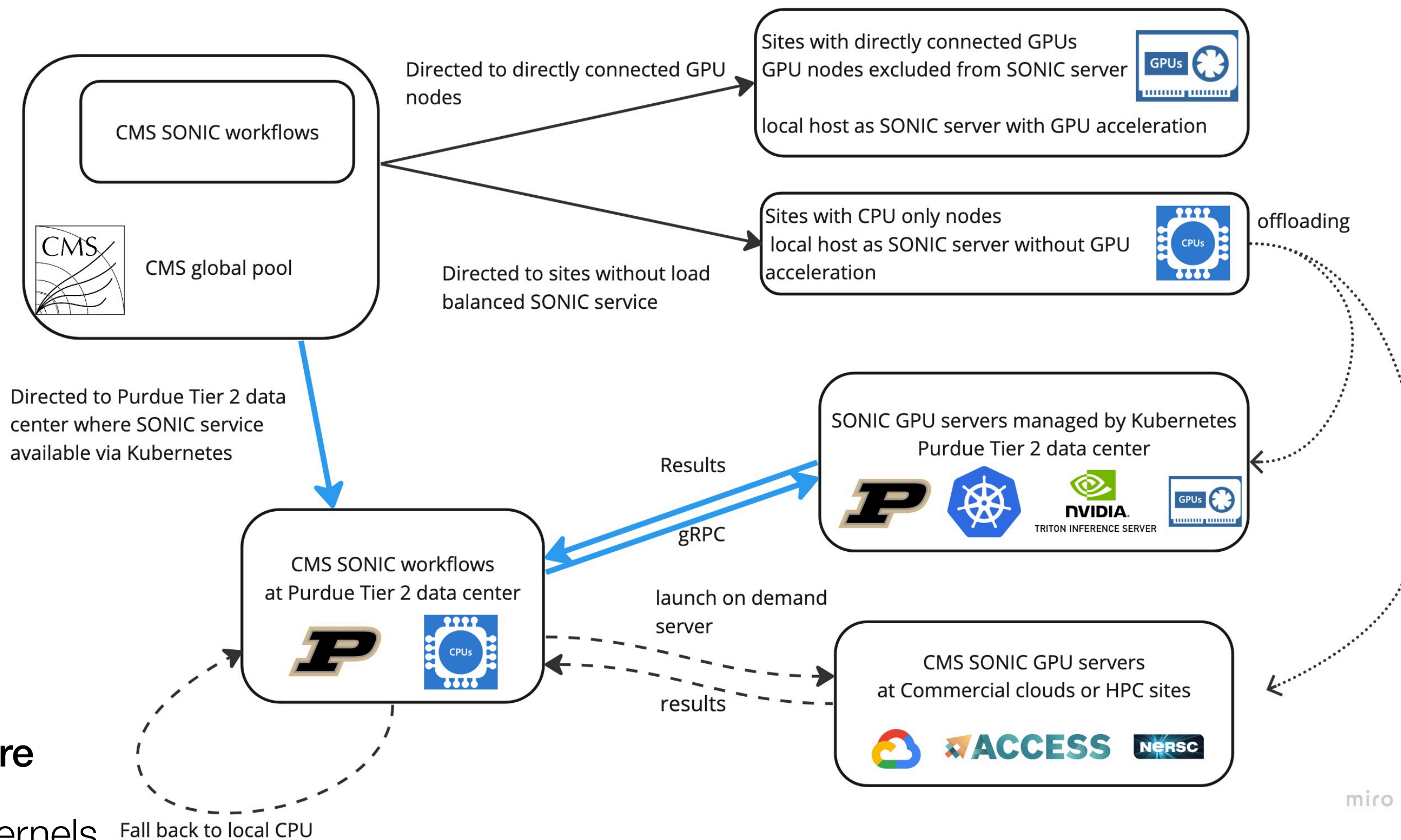
Flexible CPU to GPU ratio

Maximize acceleration with heterogenous resources

Flexible fallback solutions with homogenous client software

Server handles heterogeneous hardware types, acceleration kernels (CUDA & alpaka).

Recent result presented at CHEP 2023.



SONIC workflow in CMS production system

Analysis Software

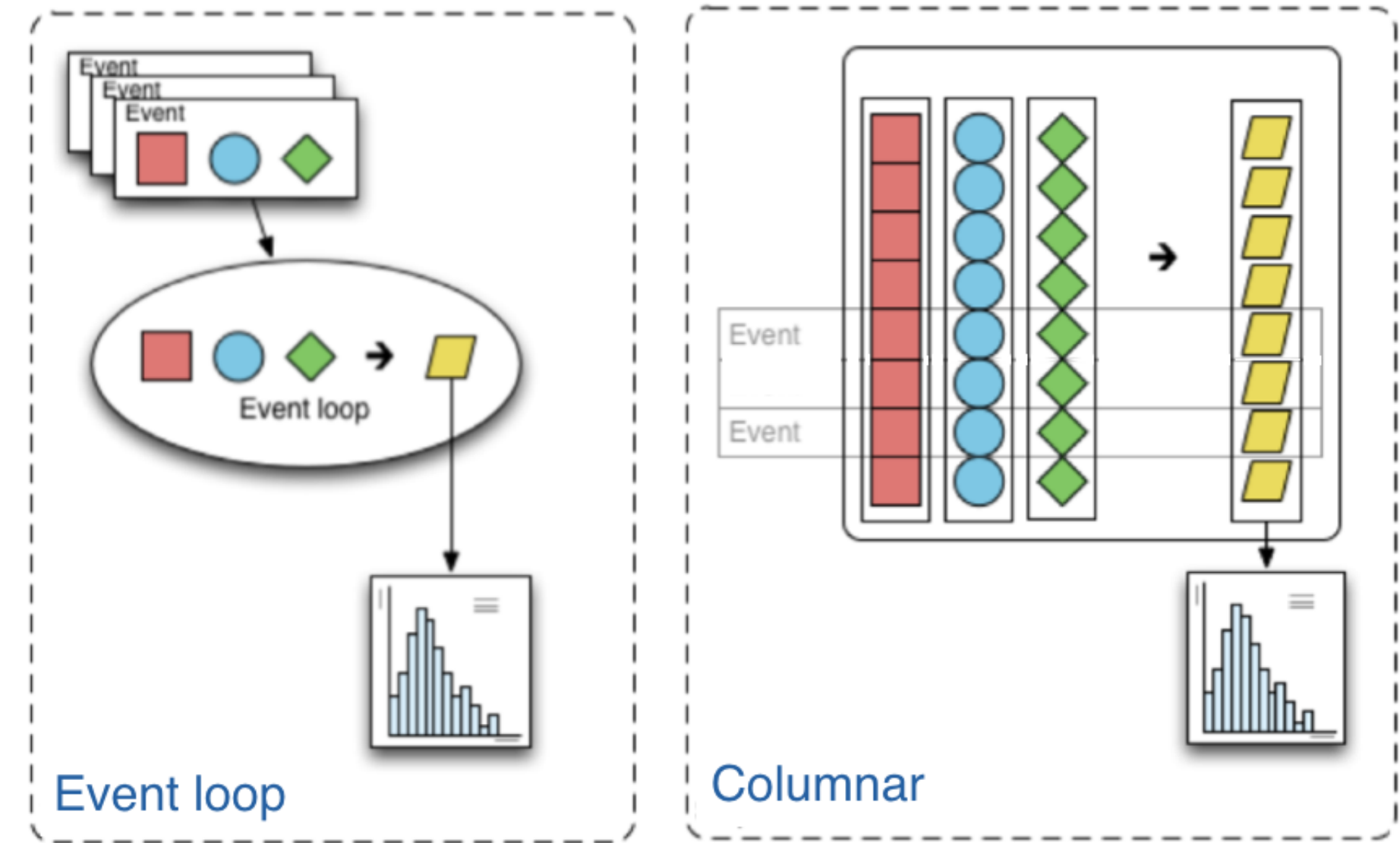
Pythonic scientific computing ecosystem

Seamless interface with data science and ML tools

Columnar analysis (Coffea)

Leverage many many cores!

Investing in facility support at CMS sites (next slide).



Coffea

uproot: Reading and writing ROOT files (just I/O)

func-adj: Remote queries

ServiceX: Remote data

DOMA Networks

SSL

Awkward Array: Manipulating arrays with nested structure (not HEP-specific)

hep-tables: DataFrame for nested structure

Coffea (/ˈko.fi/): NanoEvents, Lorentz vectors, Histogramming, Correction functions, Distributed processing...

iminuit: Raw minimization

zfit: Curve fits

pyhf: Statistical tools

hepstats: HistFactory-style fits

mplhep: Plotting

Boost histogram & hist!: Histogramming

vector: 2D, 3D, & Lorentz vectors

Particle: Pythonic PDG

Other tools shown: SciPy, NumPy, pandas, jupyter, Python, DASK, Striped, Parsl, Spark, Arrow, Laurelin, ServiceX, uproot, mplhep, etc.

Visualization	Coffea	matplotlib	mplhep	
Algorithms	SciPy	Numba	Coffea	
Array API	APACHE ARROW	NumPy	Awkward Array	
Data ingestion	Laurelin	ServiceX	uproot	
Task scheduler	APACHE Spark	DASK	Striped	Parsl
Resource provisioning	kubernetes	HTCondor	slurm	etc.

Analysis Facilities

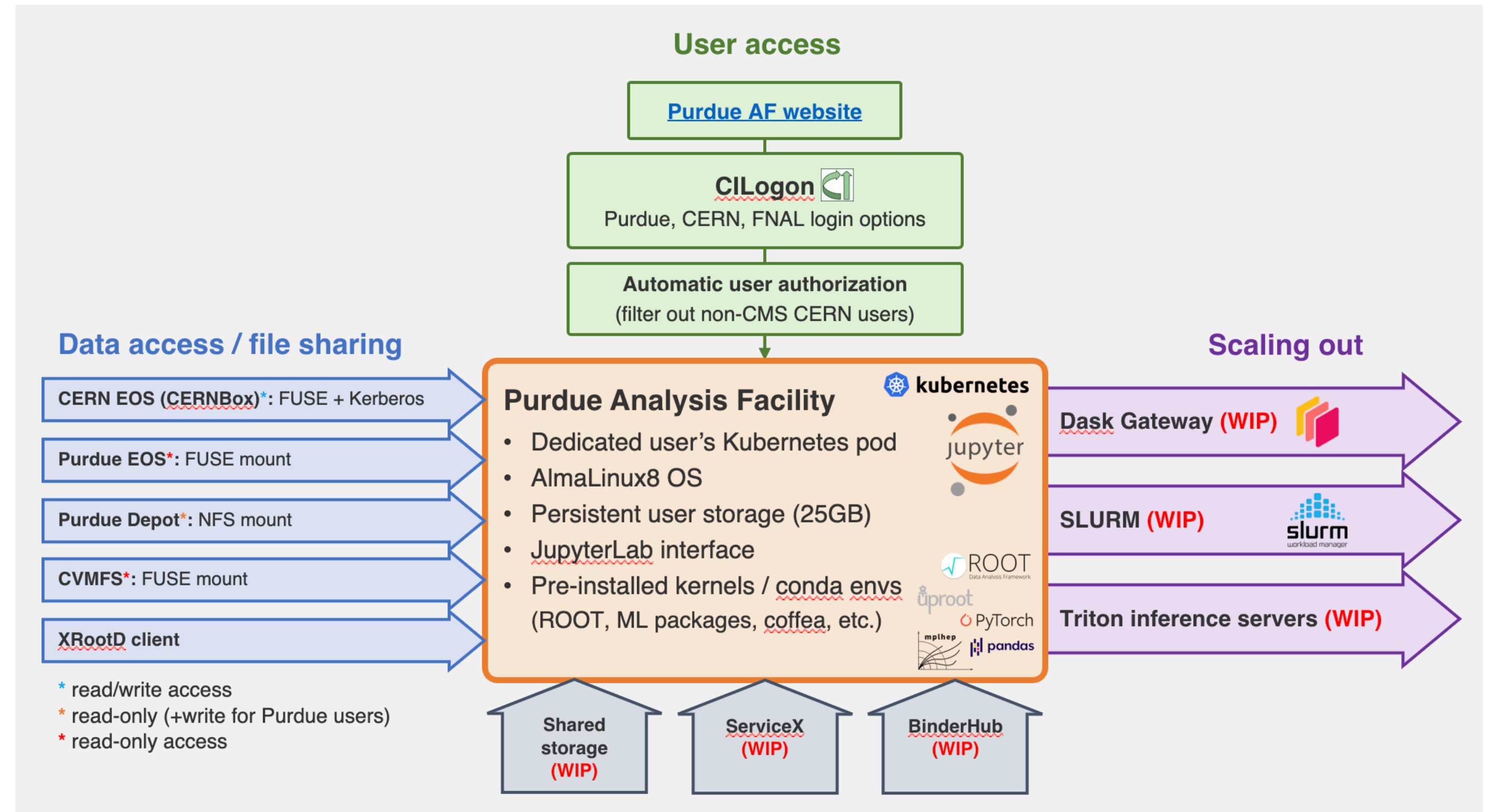
Analysis computing presently run on facilities designed for reconstruction

Investing in analysis facilities at various USCMS sites

Build infrastructure support for columnar analysis with modern softwares

Traditional style workflows can also run on these facilities, or possible with new languages, e.g Julia

Quick analysis turn around time demonstrated: ~1 hour for a Run 2 analysis demonstrated (instead of a day or more)



Example: Analysis facility prototype at Purdue

Storage R&D

Object data formats provide novel data management capabilities

Compared to **current tier-based file model**

Reduce disk storage requirements, obviate the need to define data tiers

Developing a prototype object store service

Using Ceph S3 protocol

In collaboration with FNAL CSAID storage group

I/O scales better than ROOT files



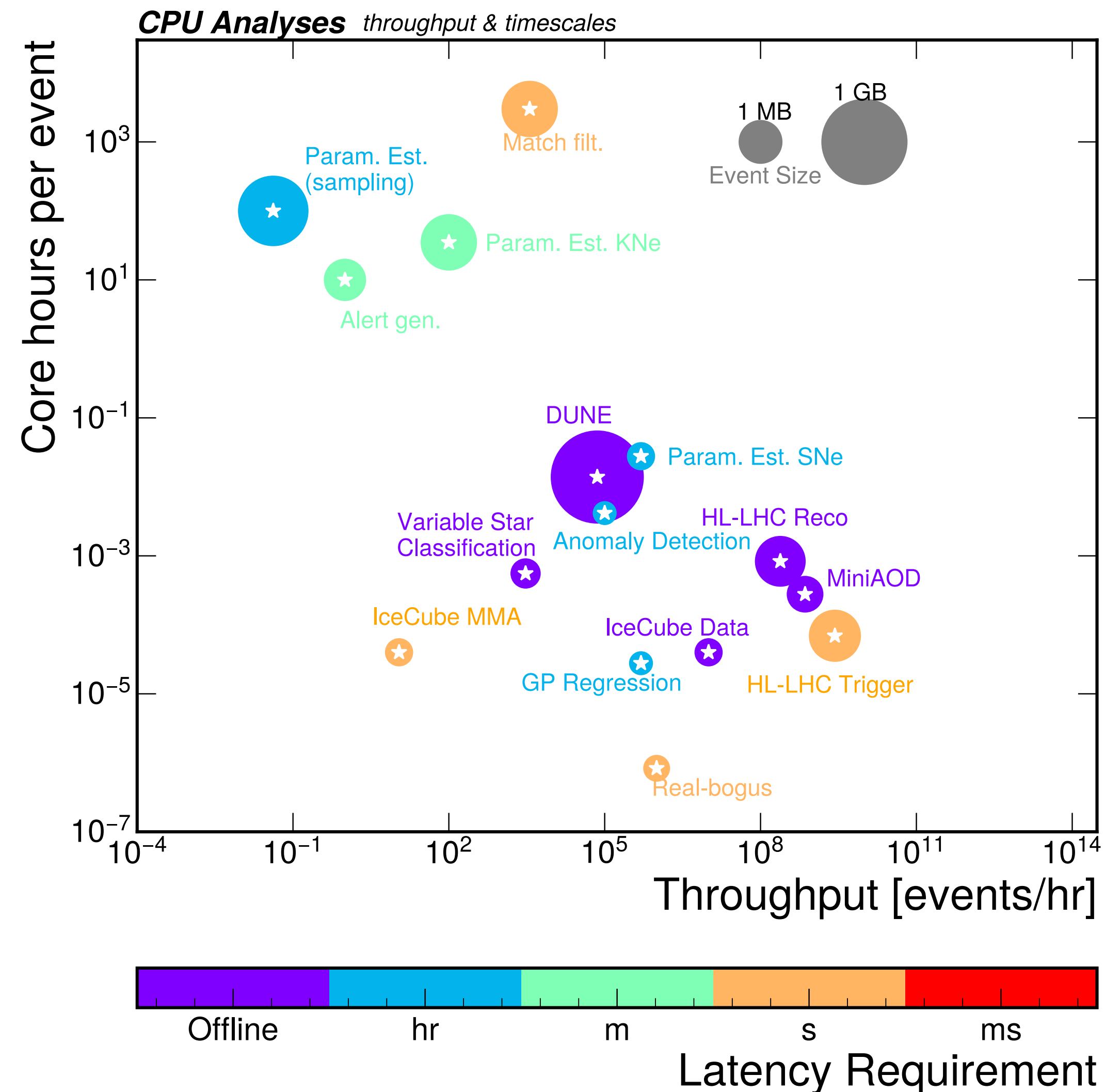
Tier-based scheme

MiniAOD Data product	KB per event	
	v1	v2
packed+pruned genParticles	5.7	5.7
slimmedElectrons	1.3	1.3
Others	48.7	48.7
Total	55.7	55.7

Object store scheme

MiniAOD Data product	KB per event	
	v1	v2
packed+pruned genParticles	5.7	-
slimmedElectrons	1.3	-
Others	48.7	-
Updated slimmedElectrons	-	1.3
Total	55.7	1.3

Big data challenges in CMS and beyond



Computing challenges present in current and next generation HEP, astrophysics experiments and beyond.

White paper: "Applications of Deep Learning to physics workflows"

CMS members leading developments in general solutions, tools, computing paradigms.

Shared resources, computing infrastructure, network challenges

Summary

Upcoming High-Luminosity LHC run present many physics opportunities

Enhanced statistics with 10 times larger dataset, new ideas in looking for BSM deviations

Computing challenges at the LHC/High-Luminosity LHC (Run 4) starting in 2029

Collider operation conditions, physics needs

Changing computing hardware landscape

Various R&D activities

Big data science era. Shared challenges, tools and solutions that enable new computing paradigms and opportunities