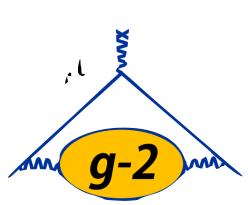


#### **GPUs for Data Acquisition and Simulation for the Muon** g-2 Experiment at Fermilab Ran Hong Wes Gohn\* **Siemens Healthineers**

\*work performed in association with the University of Kentucky

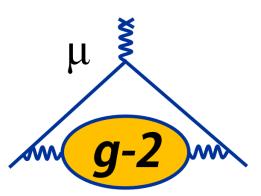


**Argonne National Laboratory** 



### Outline

- Wes Gohn:
  - Introduction to Experiment
  - Data acquisition for positron detection with CUDA
  - Monte Carlo simulation with CUDA
- Ran Hong
  - Introduction to the magnetic field measurement system
  - Analysis of the NMR signal with CUDA
  - Summary and Current Status

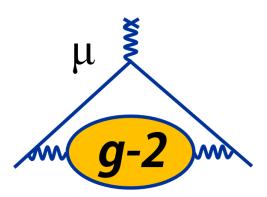


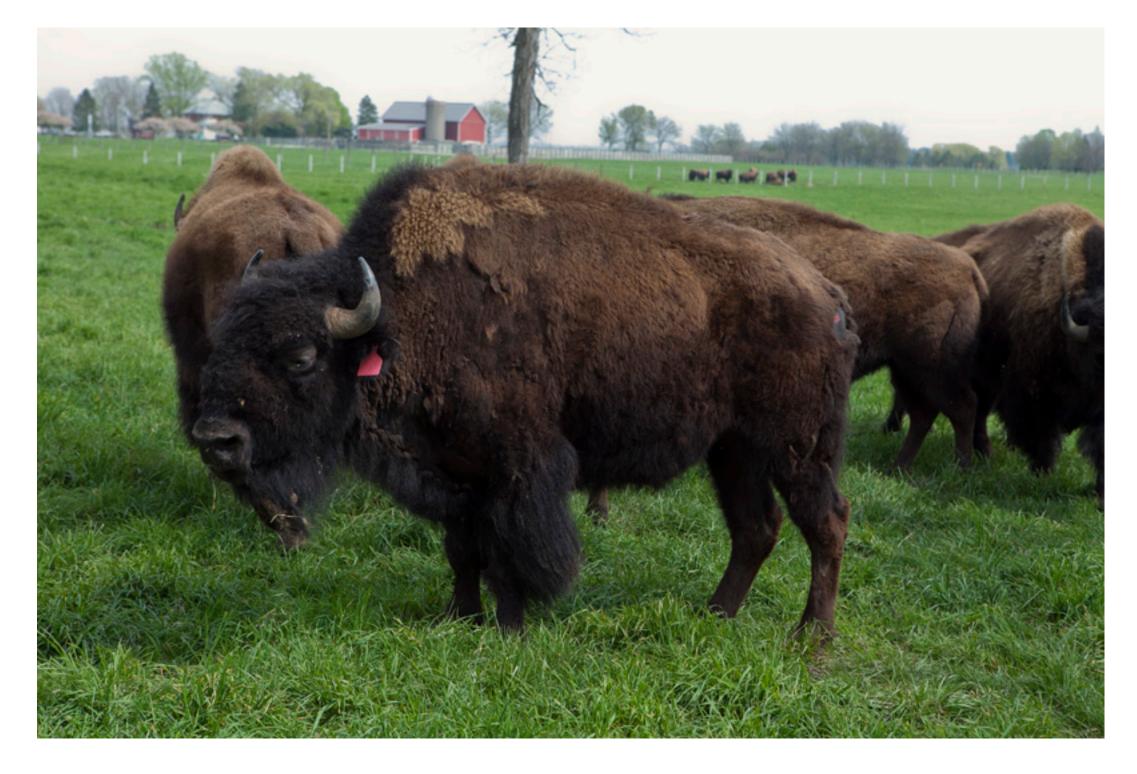




### What is Fermilab?

- Fermilab is the DOE national laboratory dedicated to particle physics
- It is located outside of Chicago, IL
- Hosted the Tevatron, which was formerly (2011) the highest energy particle accelerator in the world (1.6 TeV)
- Responsible for discoveries of the Top and Bottom quarks



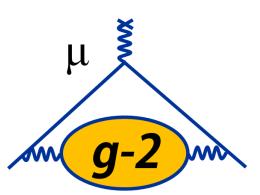


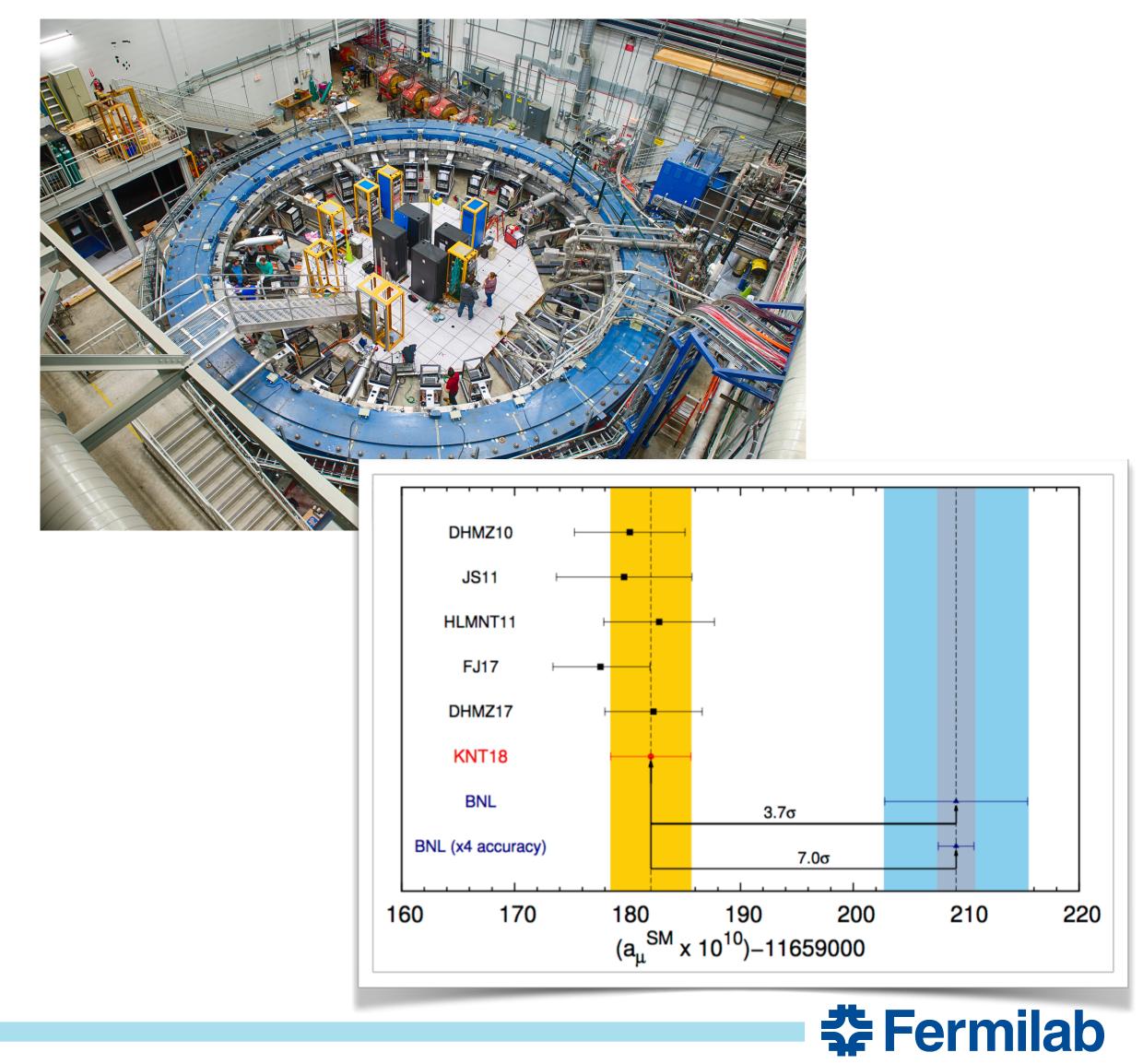
#### Fermilab bison heard



## Muon g-2 Experiment Overview

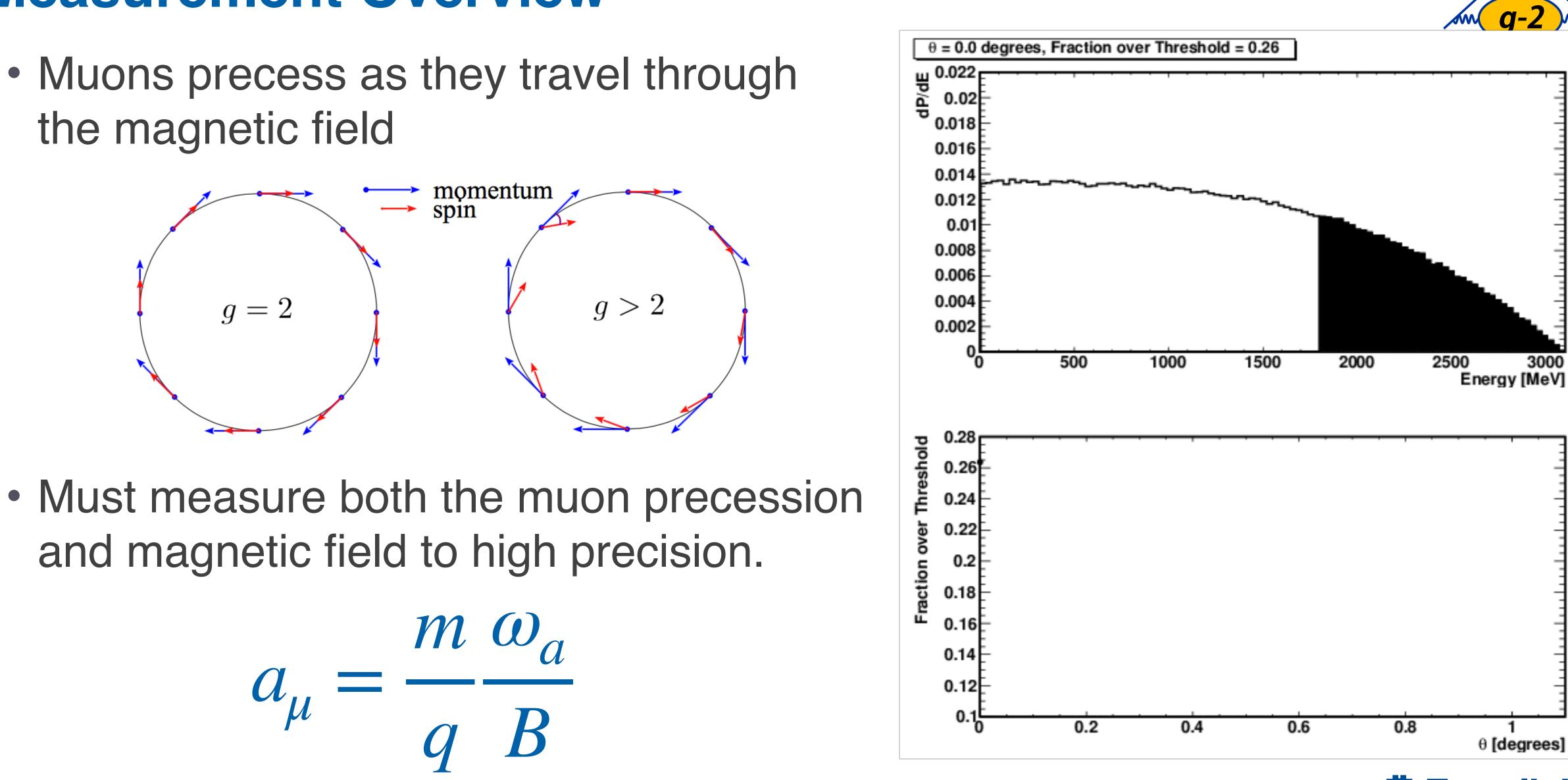
- Goal is to measure the anomalous magnetic moment of the muon to 140 ppb
- Muons injected into 50' diameter superconducting magnet.
- Muons precess as they travel through the magnetic field.
- Muons decay to positrons, which are detected in calorimeters inside the ring.





#### **Measurement Overview**

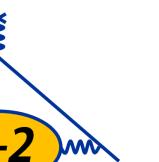
 Muons precess as they travel through the magnetic field



and magnetic field to high precision.

$$a_{\mu} = \frac{m \, \omega_a}{q \, B}$$

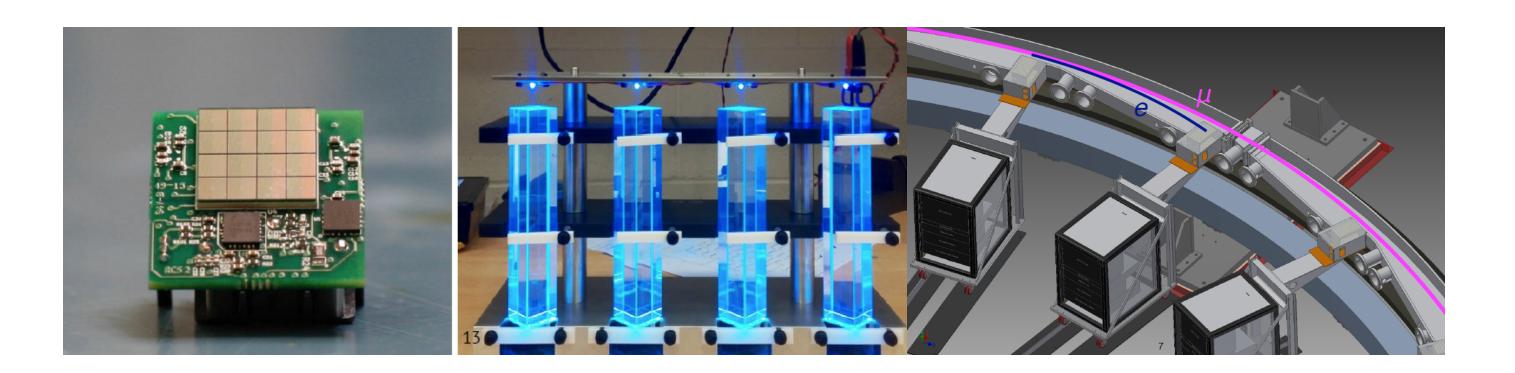
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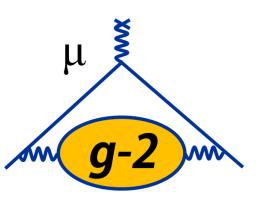


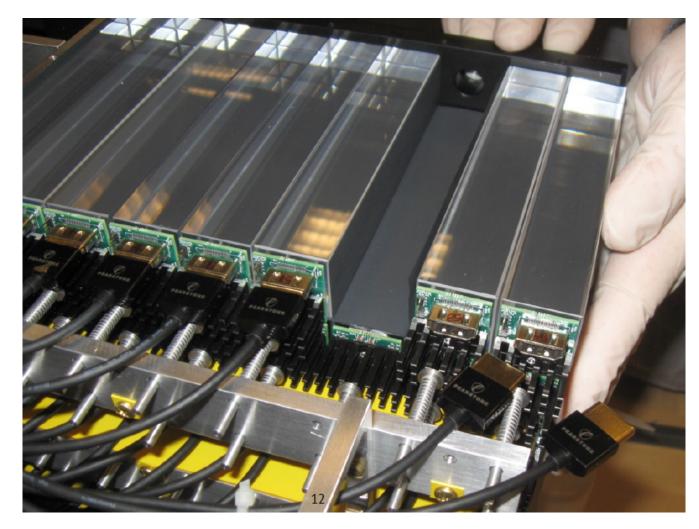
### **Positron Detectors**

- Interior of ring is lined with 24 calorimeters to detect positrons.
- Each detector is composed of 54 PbF2 crystals with silicon photomultipliers.
- Data recorded with 800 MSPS waveform digitizers in uTCA crates.
- Digitized waveforms transmitted to DAQ via direct 10 Gbps fiber connections.

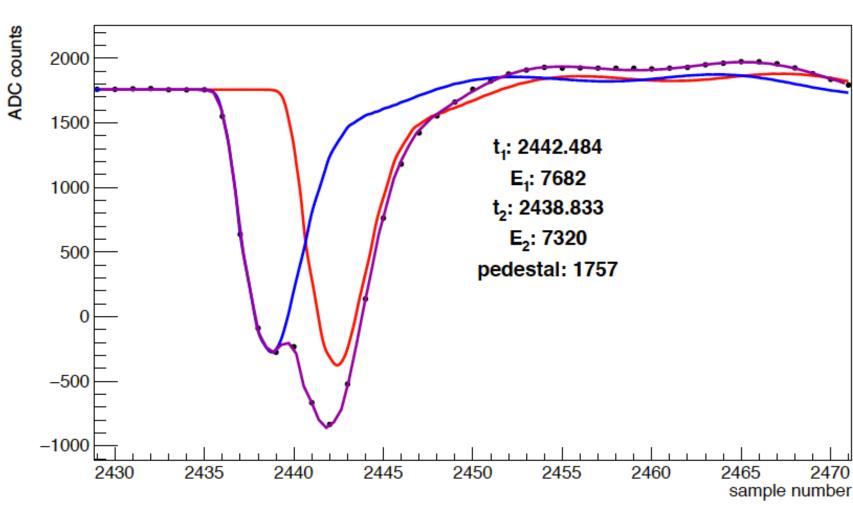


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event 7 calo 0 xtal 24 island 3

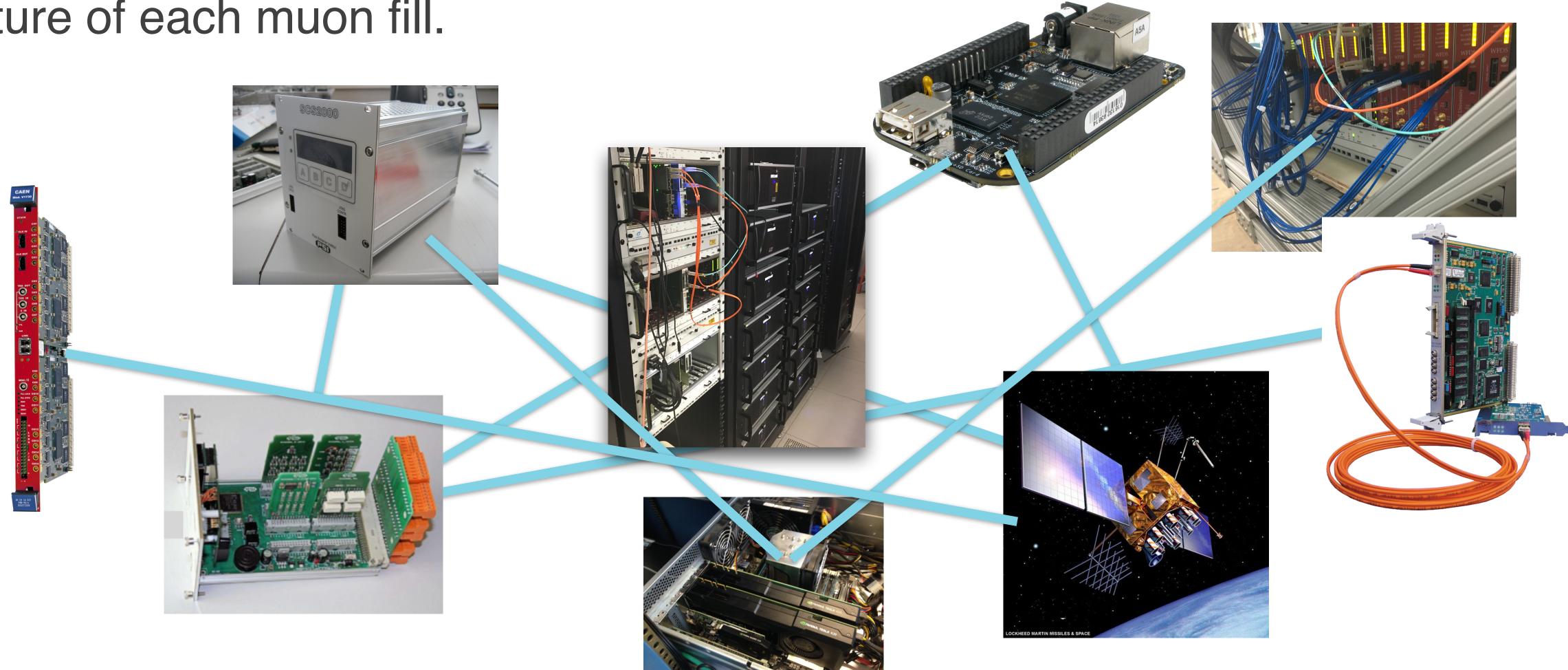






### The DAQ as an "Internet of Things"

picture of each muon fill.



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• The DAQ assembles data from a variety of sources to produce a complete







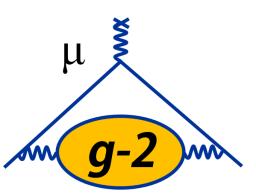


# Why GPUs?

- The GPUs dramatically improve performance by parallelizing processing.
- Technology was developed for commercial applications, so it is well supported.
- Easier to code in C++ than to learn specialized language (i.e. FPGA).
- Without GPUs, we could not keep up with our data rates.



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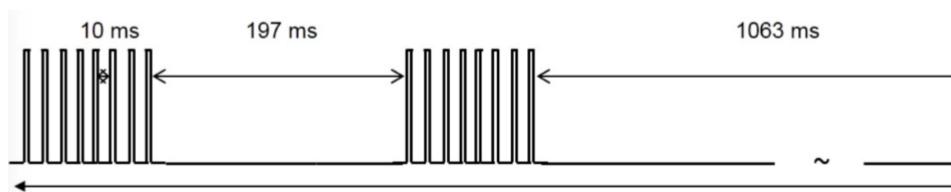






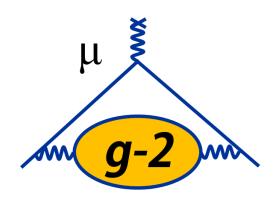
#### **Rate requirements**

 Accommodate 12 Hz average rate of mud that consist of sequences of eight succes 700  $\mu$ s fills with 10 ms fill-separations.





- Time-averaged rate of raw ADC samples is 20 GB/s, which must be reduced by a factor of 100.
- Data is processed in GPUs to accomplish this task.
- Total data on tape after 2 years of running will be 10 PB.



on	fil	ls	
ssiv	/e		

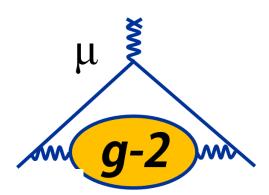
Source	MB Per Second
Raw data	20,000
T-Method	113.1
Q-Method	48.5
Prescaled Raw	20
Tracker	9
Laser Monitor	5
Auxiliary	4
Event Builder:	200

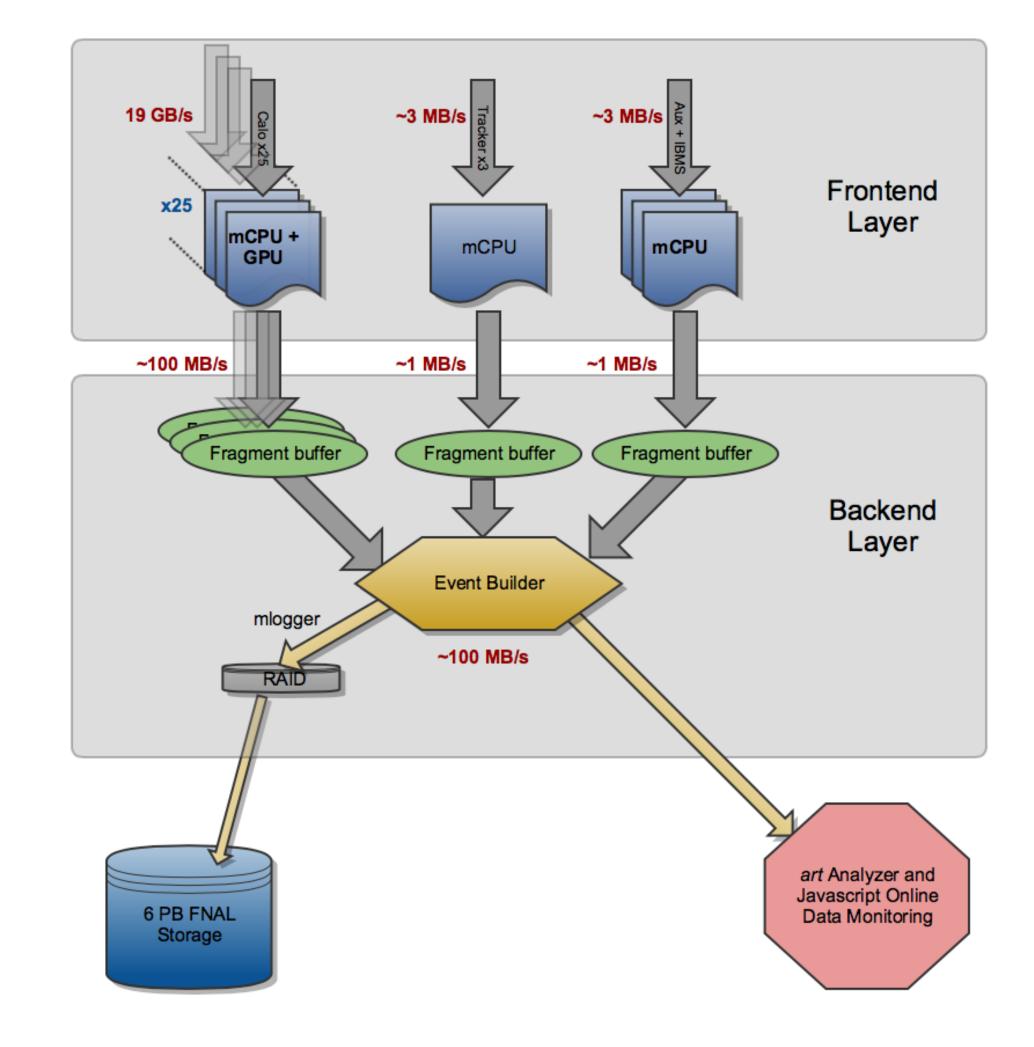




## **DAQ Design**

- Layered array of commodity, networked processors
- Frontend layer for readout of detectors.
- Backend layer for assembly of event fragments.
- Slow control layer.
- Online analysis layer using art+JS.
- Field DAQ operates independently, but with a similar design.

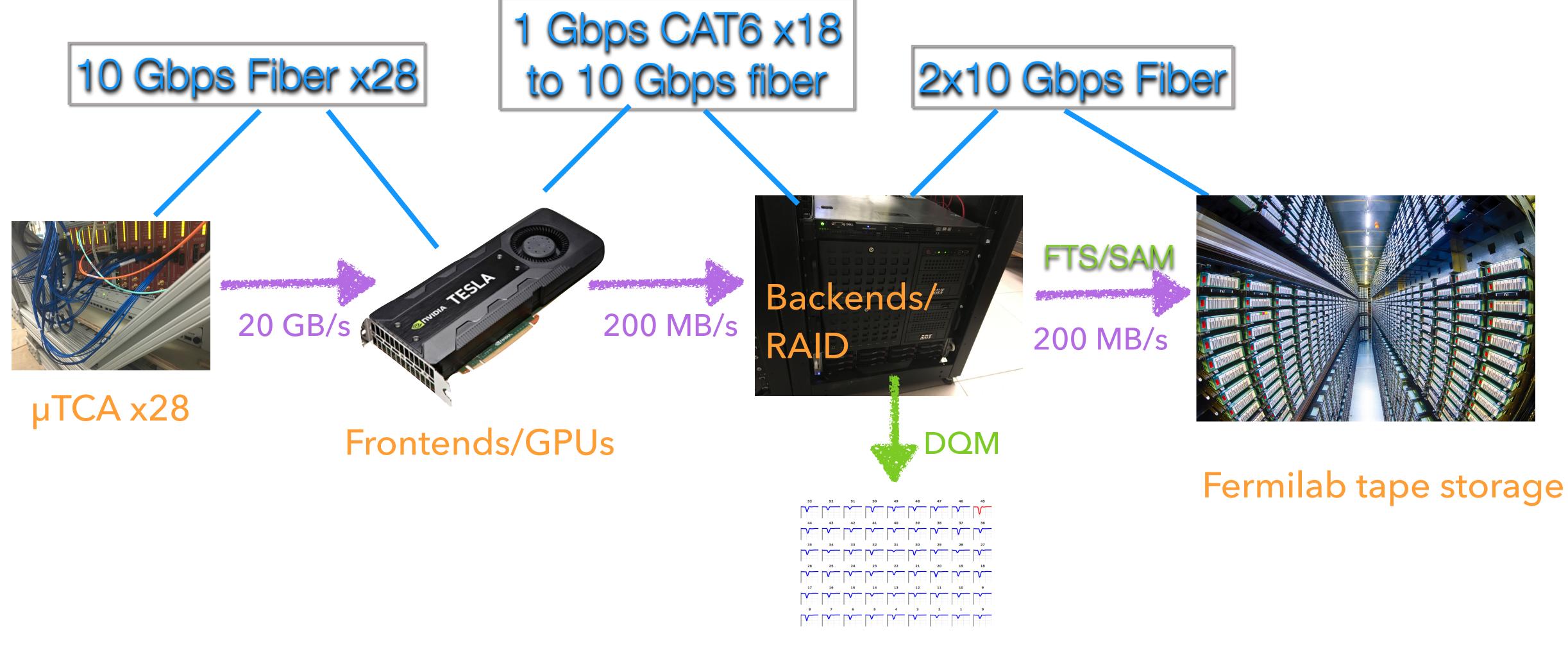




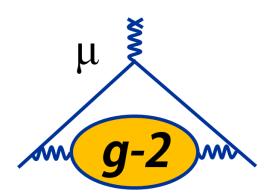




#### **Data Flow**



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### **DAQ Hardware**

- The DAQ hardware includes:
  - 17 frontend machines
  - 5 backend machines
  - 2 dedicated near line analysis machines
  - 3 computers for HV control
  - 3 servers
  - 24 beagle bones running slow controls
- Each frontend contains two Nvidia Tesla K40 GPUs
  - 2880 CUDA cores at 740 MHz
  - 288 GB/s memory bandwidth
  - 12 GB on board memory
  - ECC memory protection
- 70 TB RAID for temporary data storage.



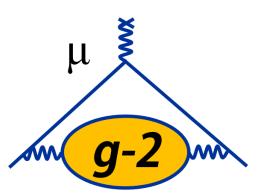


### Hardware Considerations

- Using ASUS X99-E WS/USB 3.1 motherboard for frontend systems.
- Motherboard must support PCIe version 3.0 and run at least five slots in parallel.
- Require Xeon processor to support ECC memory.
- Need motherboard with PLX chip, allowing it to distribute the load over 40 lanes in order to operate all PCIe slots at 16x.

PCle version	GPU	Host to device, Pageable	Host to device, Pinned
2.0	K20	3326.6 MB/s	5028.3 MB/s
3.0	K20	5628.6 MB/s	6003.6 MB/s
3.0	K40	6647.8 MB/s	10044.3 MB/s

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#### **MIDAS Software**

- MIDAS is a DAQ software package
- Provides a web-interface for control of the experiment, data logging, and event building.
- We write frontend code in C++ and CUDA that processes the data and sends it to the event builder.
- 32 fast frontends reduce data volume for each event by a factor of 100 and store data in Midas banks.
- 35 slow control frontends process slow data.
- Includes alarm system and sequencer.
- Software configuration is dumped to a JSON file and saved to a PostgreSQL database at the end of each run.

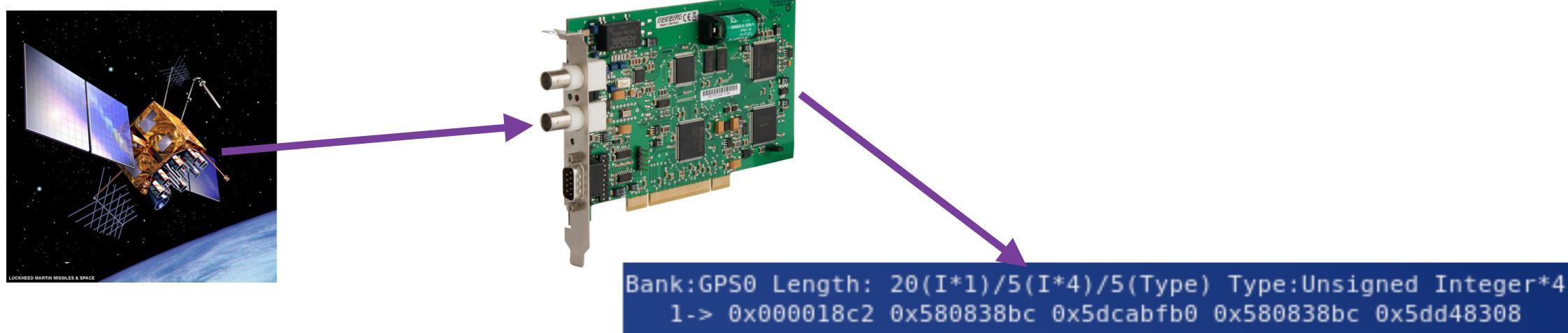
	Status	DDB Messages Alarms Program	s Sequencer 0	Config	Help	
				<u> </u>	<u></u>	
	_	Test Restart Fast Fro	intends			
	Cha	nMap    Straw Tracker Power    Straw	/ Tracker Settings	WFD5		
		Run Status				
Run	Star	t: Wed Jun 28 05:38:50 2017		Rur	ning time: 0h29	)m03s
1618	Alarms: 0	n 👔 Restart: Yes		D	ata dir: /data2/	gm2
i san ni ni ng	periment Nam	ne: GM2				
Stop	t hash: C Run State:	Run In Progress				
		-				
06:07:20[	Logger,INFO] ch	annel /data2/gm2/gm2_run0161	8_47.mid writer c	hain: CR	C32C   CRC32C	5   >
		Equipment				
Equipment +		Status	E	vents	Events[/s]	Data[MB/s
MasterGM2		MasterGM2@g2be1.fnal.go	v]	1222	0.7	0.000
EB AMC1300		Ebuilder@g2be1.fnal.gov AMC1300@g2aux-priv		1221 1223	0.0	0.000
AMC1300	<u> </u>	AMC1301@g2calo0102-dat	a	1223	1.0	2.016
AMC1302		AMC1302@g2calo0102-dat		1222	0.7	1.949
AMC1303		AMC1303@g2calo0304-dat		1221	0.7	0.096
AMC1304		AMC1304@g2calo0304-dat		1221	0.7	0.095
AMC1305 AMC1306		AMC1305@g2calo0506-dat AMC1306@g2calo0506-dat		1222 1223	0.9	1.780 1.986
AMC1306 AMC1307		AMC1306@g2calo506-data AMC1307@g2calo-spare-pri		1223	0.7	1.986
AMC1308		AMC1308@g2calo-spare-pri		1221	0.7	0.093
AMC1309		AMC1309@g2calo0910-dat	a	1221	0.7	0.094
AMC1310		AMC1310@g2calo0910-dat		1222	0.7	1.968
AMC1311 AMC1312		AMC1311@g2calo1112-dat AMC1312@g2calo1112-dat		1222 1223	0.7	1.940 1.944
AMC1312 AMC1313		AMC1312@g2calo1112-data AMC1313@g2calo1314-data		1223	1.0	1.944
AMC1314		AMC1314@g2calo1314-dat		1222	0.7	1.963
AMC1315		AMC1315@g2calo1516-dat		1221	0.7	0.095
AMC1316		AMC1316@g2calo1516-dat		1223	0.7	1.911
AMC1317 AMC1318		AMC1317@g2calo1718-dat		1222 1223	0.7	1.954 1.928
AMC1318 AMC1319		AMC1318@g2calo1718-dat AMC1319@g2calo1920-dat		1223	0.7	1.928
AMC1320		AMC1320@g2calo1920-dat		1221	0.7	0.092
AMC1321		AMC1321@g2calo2122-dat		1221	0.7	0.093
AMC1322		AMC1322@g2calo2122-dat		1221	0.7	0.125
AMC1323		AMC1323@g2calo2324-dat		1222	0.7	1.858
AMC1324 AMC1325		AMC1324@g2calo2324-dat AMC1325@g2laserdaq-data		1223 1221	1.0	1.977 0.069
AMC1325		AMC1326@g2iaseruaq-uaa AMC1326@g2iaux-priv	·	1221	0.7	5.735
trawTrackerLVandS	3C03 🔁 Sti	rawTrackerLVandSC03@g2tracker	1.fnal.gov	0	0.0	0.000
StrawTrackerDA	· .	StrawTrackerDAQ@g2tracker0.fr		1221	0.7	0.006
StrawTrackerHV0	3	StrawTrackerHV03@g2tracker1.fr		0	0.0	0.000
IBMS Detector CaloSC01		IBMS Detector@g2ibms-pri CaloSC01@g2sc-priv	<u> </u>	1223 0	0.7	0.121
CaloSC02		CaloSC02@g2sc-priv		0	0.0	0.000
CaloSC03		CaloSC03@g2sc-priv		0	0.0	0.000
CaloSC04		CaloSC04@g2sc-priv		0	0.0	0.000
CaloSC05		CaloSC05@g2sc-priv		0	0.0	0.000
CaloSC06 CaloSC07		CaloSC06@g2sc-priv CaloSC07@g2sc-priv		0	0.0	0.000
CaloSC07		CaloSC08@g2sc-priv		0	0.0	0.000
CaloSC09		CaloSC09@g2sc-priv		0	0.0	0.000
CaloSC10		CaloSC10@g2sc-priv		0	0.0	0.000
CaloSC11		CaloSC11@g2sc-priv		0	0.0	0.000
CaloSC12 CaloSC13		CaloSC12@g2sc-priv CaloSC13@g2sc-priv		0	0.0	0.000
CaloSC13 CaloSC14		CaloSC13@g2sc-priv CaloSC14@g2sc-priv		0	0.0	0.000
CaloSC14 CaloSC15		CaloSC15@g2sc-priv		0	0.0	0.000
CaloSC16		CaloSC16@g2sc-priv		0	0.0	0.000
CaloSC17		CaloSC17@g2sc-priv		0	0.0	0.000
CaloSC18		CaloSC18@g2sc-priv		0	0.0	0.000
CaloSC19 CaloSC20		CaloSC19@g2sc-priv CaloSC20@g2sc-priv		0	0.0	0.000
CaloSC20 CaloSC21		CaloSC20@g2sc-priv CaloSC21@g2sc-priv		0	0.0	0.000
CaloSC22		CaloSC22@g2sc-priv		0	0.0	0.000
CaloSC23		CaloSC23@g2sc-priv		0	0.0	0.000
CaloSC24		CaloSC24@g2sc-priv		0	0.0	0.000
ESQ_slow		ESQ_slow@g2quad-01		1729	1.0	0.000
ESQ IFIX		ESQ@g2quad-02-priv Ok		1223 173	0.7	0.000
mscb110		Ok Ok		29	0.0	0.000
mscb13e		Ok		2871	0.0	0.000
mscb319		Ok		29	0.0	0.000
mscb323		Ok		29	0.0	0.000
KickerSC_mscb28 mscb174	52	Ok Ok		29 29	0.0	0.000
Beam		Beam@g2sc-priv		29 346	0.3	0.000
		- Same Same but				0.000
		Logging Chani				

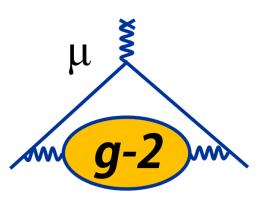


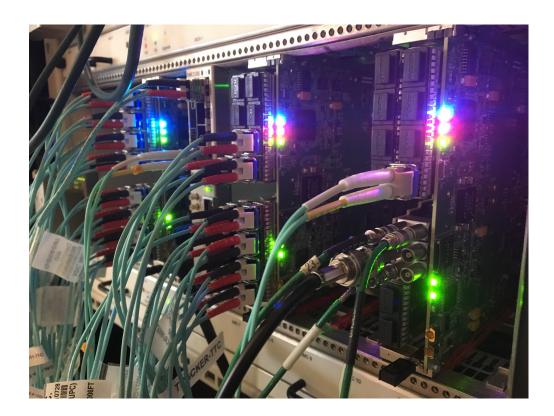


#### Master frontend

- Communicates with other frontends using RPC calls.
- Provides begin of run and end of run RPCs to all frontends.
- Provides end of fill trigger to synchronous frontends.
- Configures clock and control system.
- Reads trigger times from Meinberg GPS unit and writes them to a MIDAS bank.







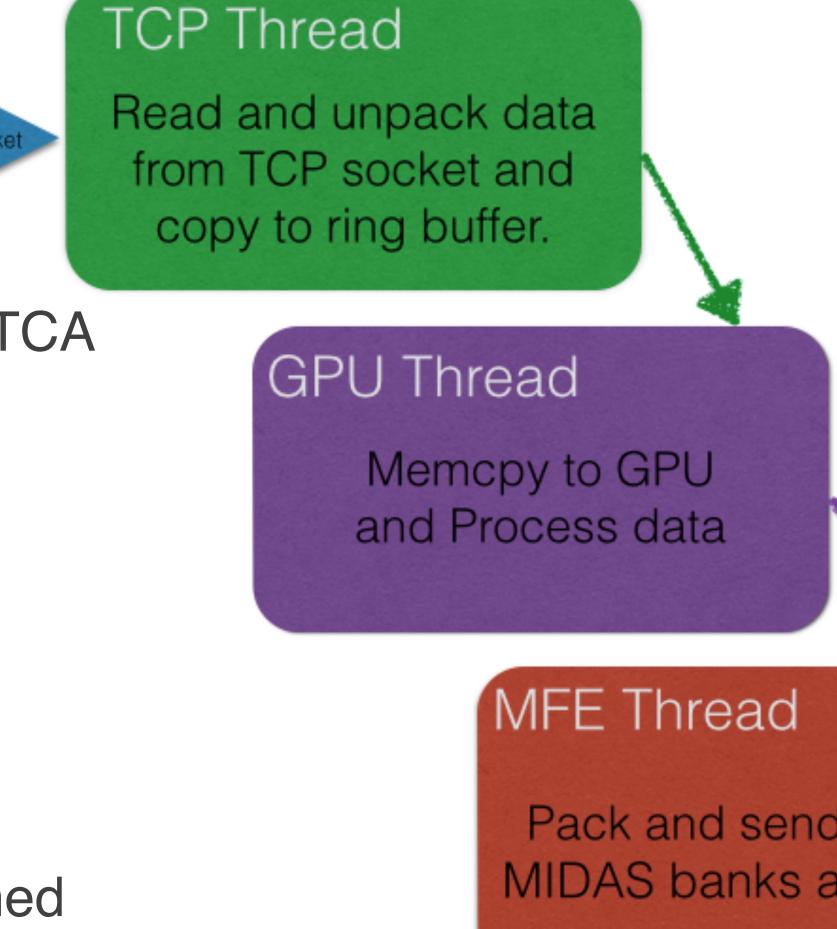


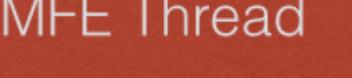


#### **GPU Frontend**



- Each frontend process reads data from one uTCA crate over 10 Gb ethernet with TCPIP.
- Frontend is multithreaded with mutex locks.
- Data is processed in Nvidia Tesla K40 GPUs using CUDA code that is integrated into the frontend.
- Midas banks are losslessly compressed using zlib.
- Full configuration of the uTCA crate is performed via the MIDAS ODB using IPBus.





Pack and send data to MIDAS banks and DQM



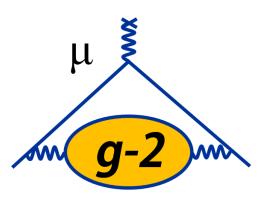


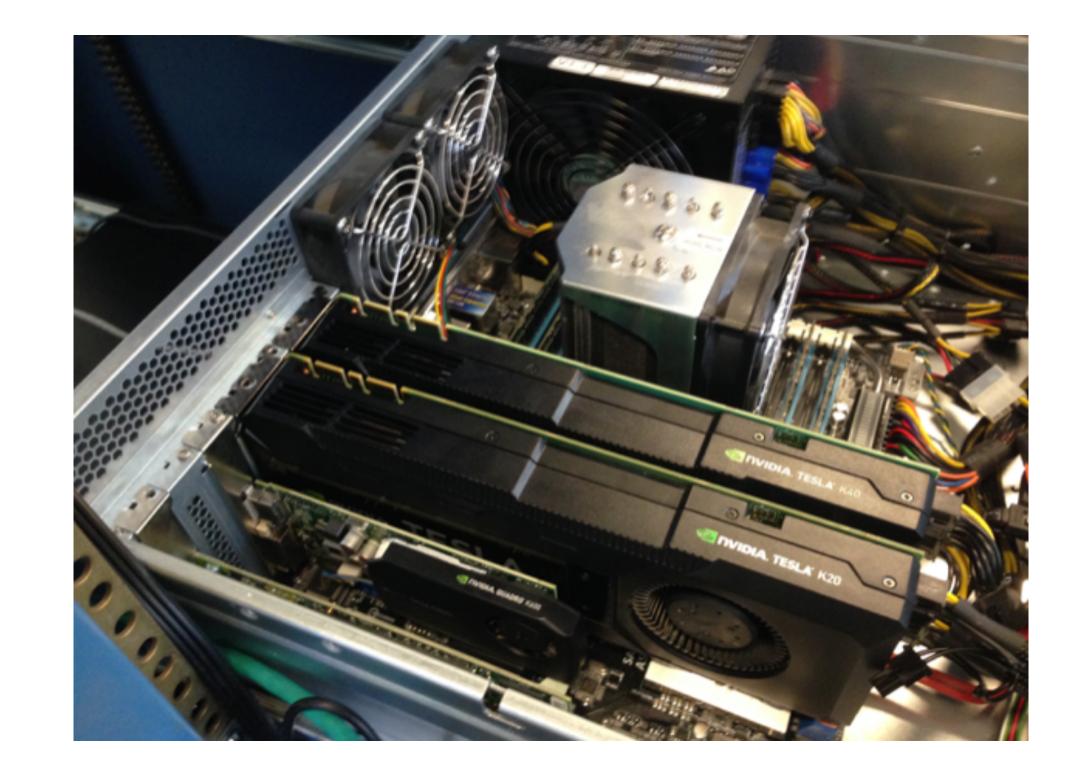




### **GPU Processing**

- The frontend includes CUDA routines for data processing.
- Each GPU processes data from one calorimeter.
- Raw fill is copied to GPU memory, where it is reduced using T-method (island chopping), Q-method (histogramming), pedestal calculation, and template fitting.
- The output of each process is written in one MIDAS bank.

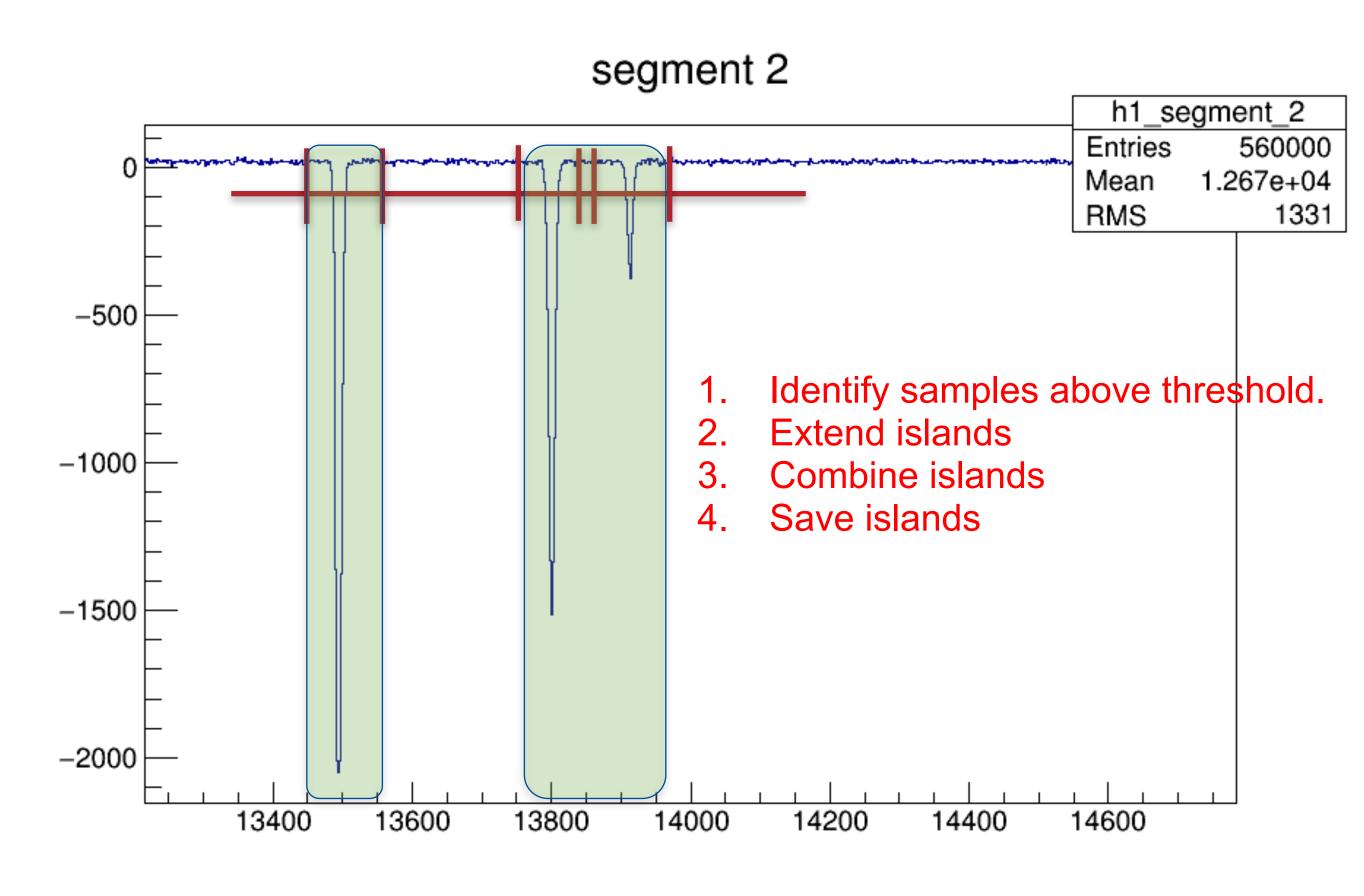




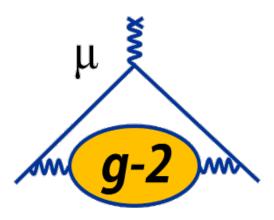


#### **T-Method**

- Identify and save regions of the waveform containing positron hits.
- A typical waveform will have ~180 islands.



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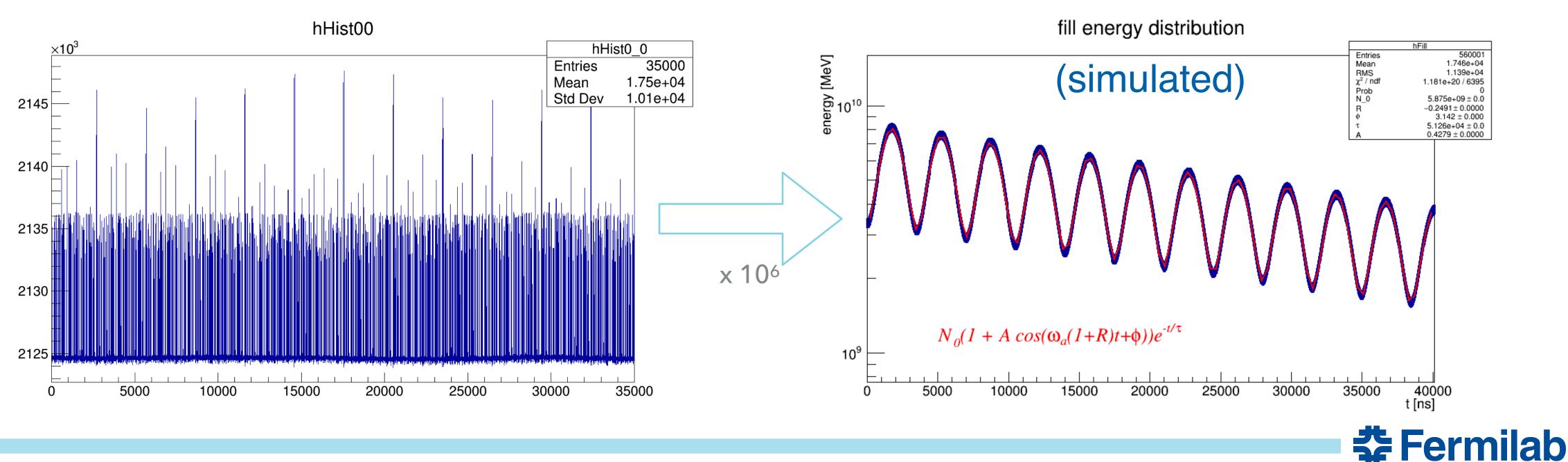




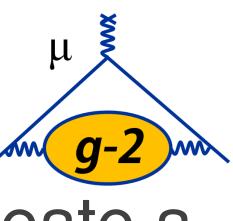


### **Q-method**

- Full waveforms are decimated in time and summed over many fills to create a histogram that is saved in the data file.
  - i.e. If we decimate in time by 10 and flush every 100 fills, we reduce the data rate by a factor of 1000, so from 20 GB/s to 20 MB/s.
- Use smaller bins at lower times and wider bins at later times to insure that we can extract the pedestal.



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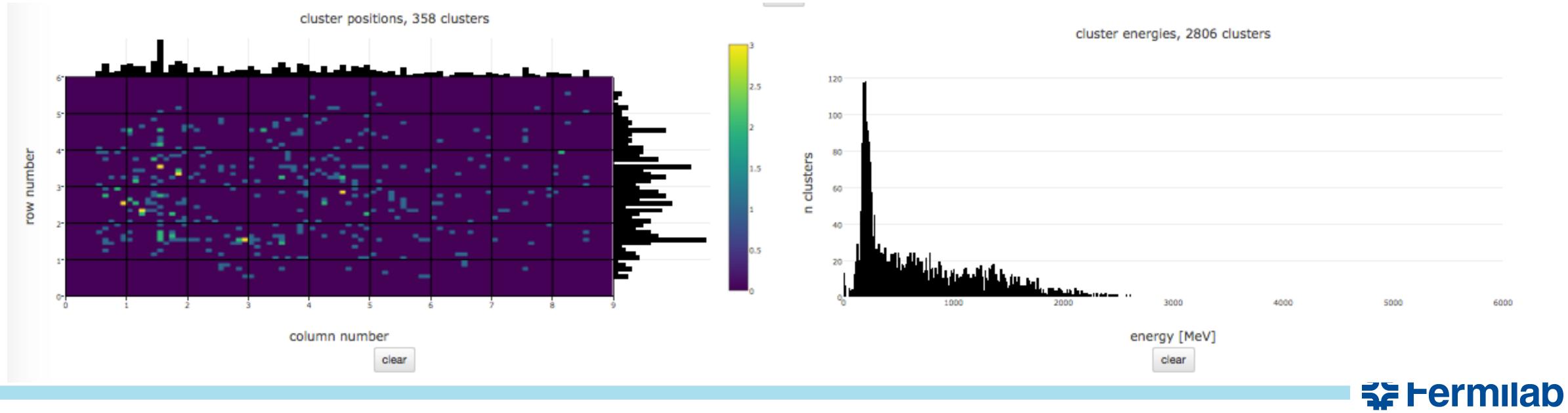




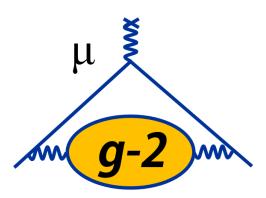


### **GPU Template Fits**

- above a certain threshold.
- chopped islands.
- Reduces the processing necessary in the online DQM.



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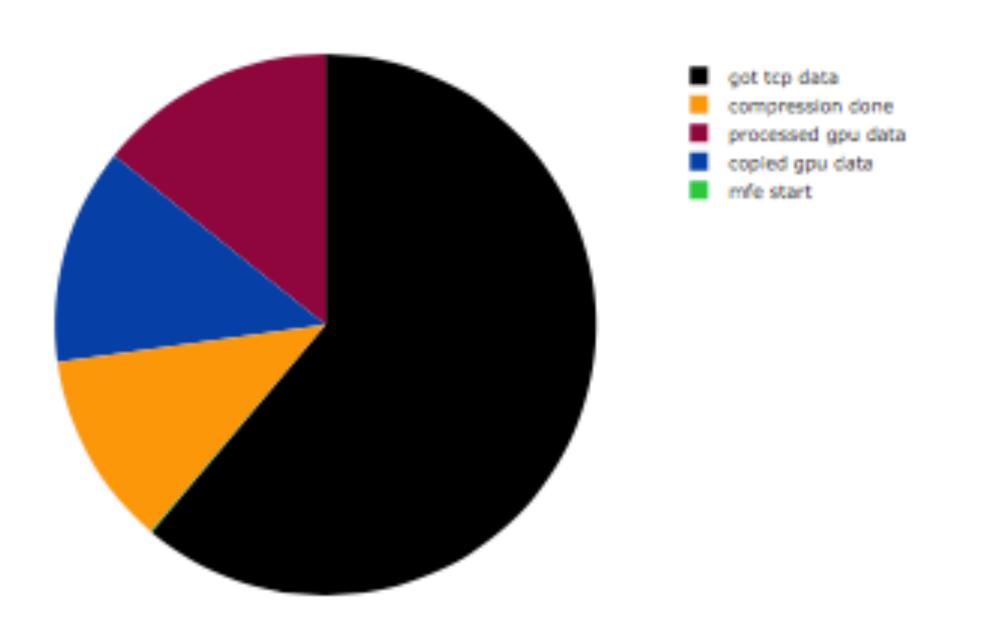


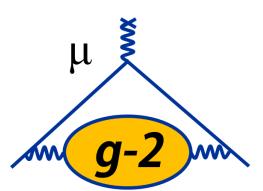
#### • Fit templates are loaded into the GPU memory and used to fit each peak

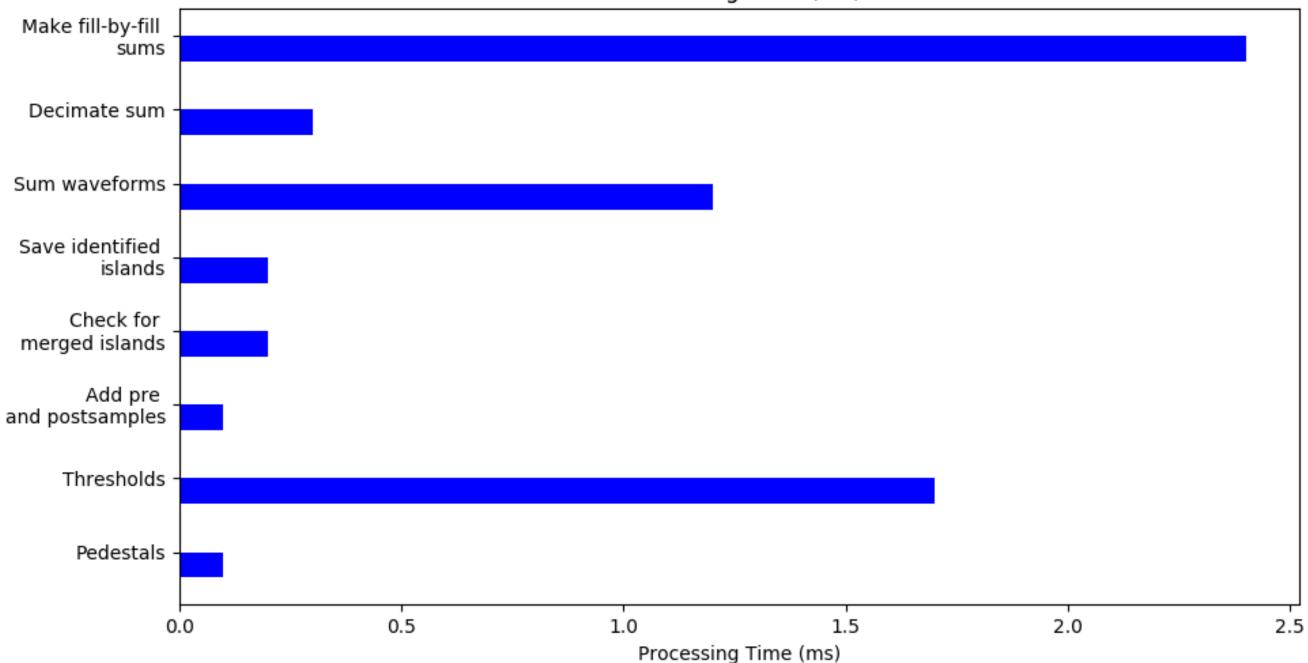
#### A bank containing the fit results will be saved for each fill in addition to the

### **Processing time**

- Must process each event in 83 ms to keep up with average beam rate of 12 Hz.
- Most time is spent reading data from TCP socket and copying it to the GPU.
- Processing time in the GPU is very small.





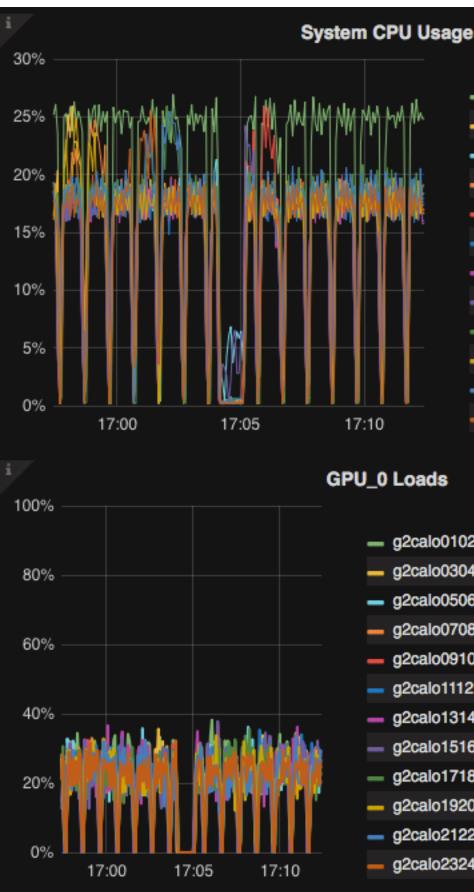


#### Processing Time (ms)



### **DAQ Health Monitor**

- Monitored health of DAQ systems using:
  - netdata for system monitoring
  - prometheus for short term data storage
  - grafana to display data.
- Monitors GPU temperatures, loads, and memory
- Alarms via Slack if any quantity is out of bounds



	GPU_0 Loads		
		max	a
	— g2calo0102	38.20%	22.07
	<b></b> g2calo0304	35.60%	19.33
	<ul> <li>g2calo0506</li> </ul>	36.20%	18.89
	<u> </u>	33.00%	18.94
	g2calo0910	36.80%	18.72
	g2calo1112	35.40%	19.23
	- g2calo1314	36.60%	19.30
6	g2calo1516	37.80%	19.47
	g2calo1718	35.60%	18.90
1	<u> </u>	33.80%	18.87
	- g2calo2122	33.80%	18.73
	a2calo2324	32.00%	18,74

	avg	current
g2calo0102	19.57%	24.82%
g2calo0304	14.43%	16.95%
g2calo0506	14.30%	16.67%
g2calo0708	14.40%	19.05%
g2calo0910	14.45%	16.91%
g2calo1112	13.57%	17.63%
g2calo1314	13.53%	15.76%
g2calo1516	14.05%	16.00%
g2calo1718	14.76%	17.90%
g2calo1920	14.04%	18.36%
g2calo2122	15.07%	17.34%
g2calo2324	14.12%	16.61%

100%

80%

60%

40%

20%

curren

27.75%

26.60%

24.80%

20.20%

29.20%

22.60%

29.00%

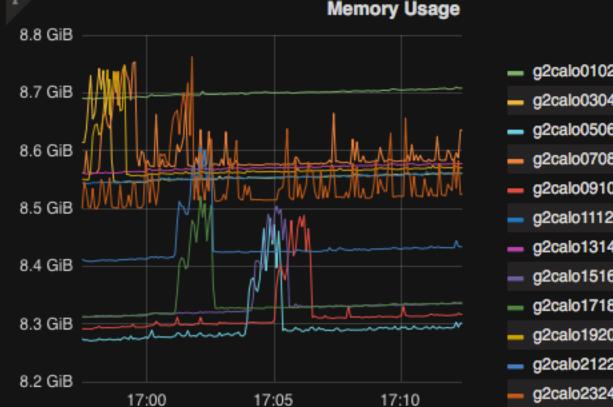
26.80%

24.80%

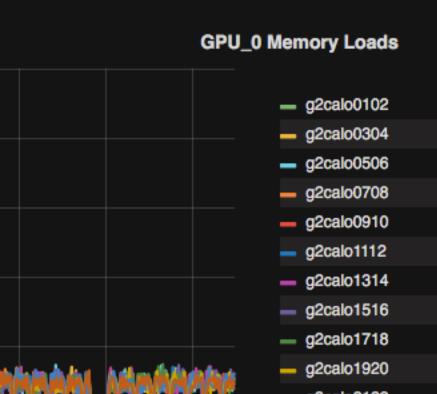
22.40%

29.40%

25.80%

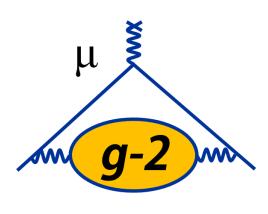


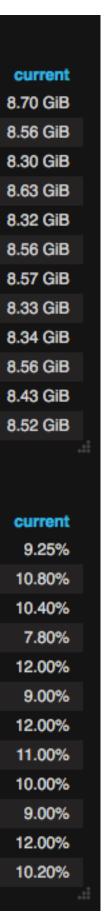
-	g2calo0506	
-	g2calo0708	
-	g2calo0910	
-	g2calo1112	
-	g2calo1314	
-	g2calo1516	
-	g2calo1718	
	g2calo1920	
-	g2calo2122	
_	g2calo2324	



	max	avg
g2calo0102	13.40%	7.67%
g2calo0304	14.00%	7.65%
g2calo0506	14.60%	7.67%
g2calo0708	13.40%	7.57%
g2calo0910	13.80%	7.53%
g2calo1112	14.00%	7.59%
g2calo1314	14.20%	7.70%
g2calo1516	14.60%	7.80%
g2calo1718	14.80%	7.65%
g2calo1920	13.80%	7.60%
g2calo2122	13.80%	7.71%
g2calo2324	13.00%	7.52%



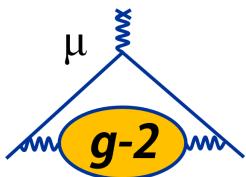




#### **Data Quality Monitor**



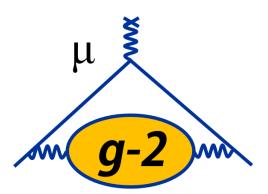
24 3/21/19 W. Gohn (Siemens Healthineers) I GPUs for DAQ and Simulation in Muon g-2



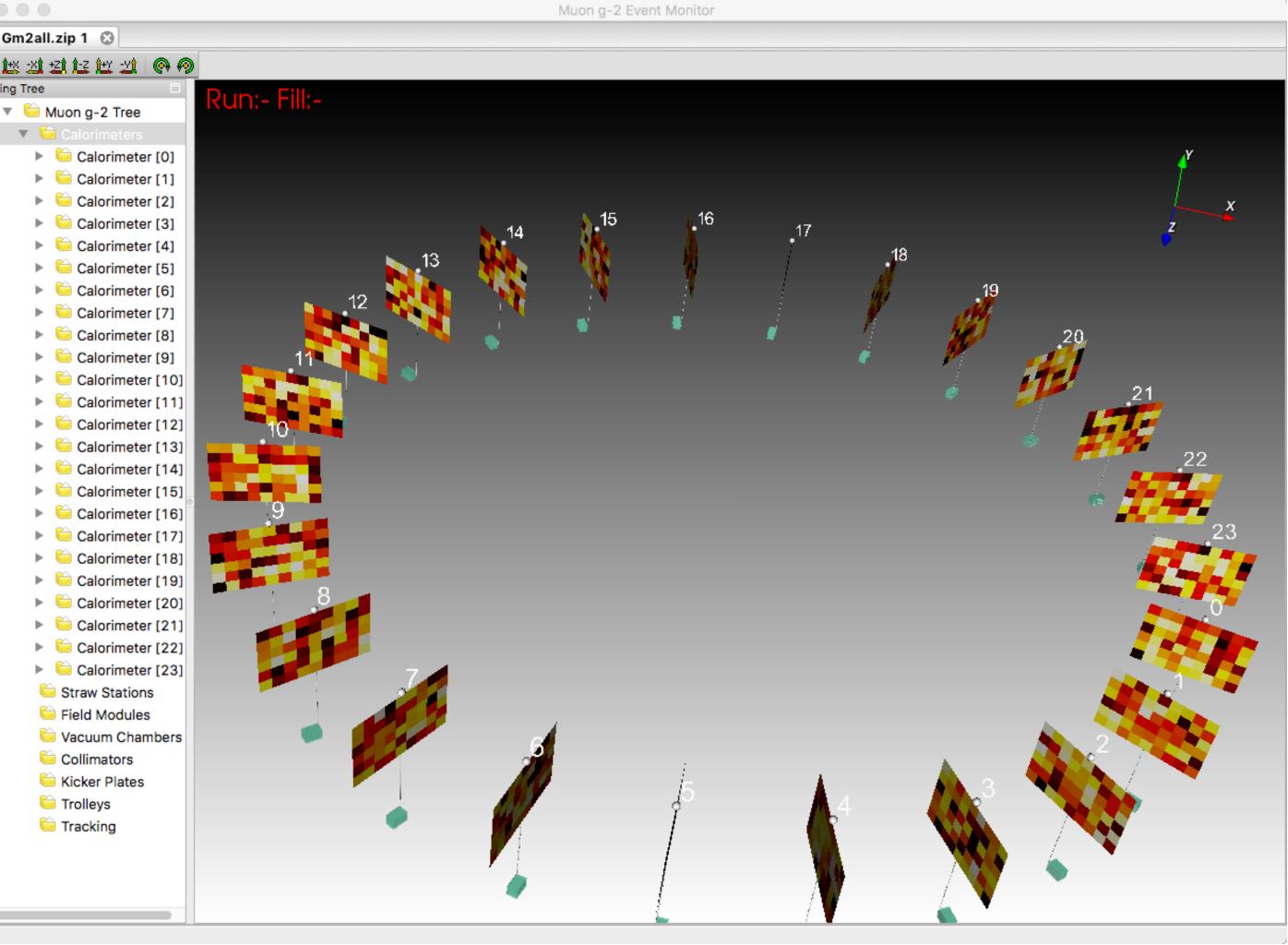


### **Event Display**

- Based on Paraview (vtk).
- Reads data from GPU template fits to create heat map on each calorimeter.
- Display can rotate, zoom
- Access to data quality plots
- Currently includes only calorimeters, but plan to add more subsystems soon.



Muon g-2 Event Monitor



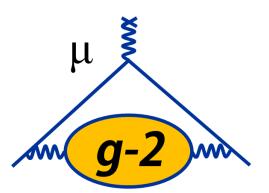


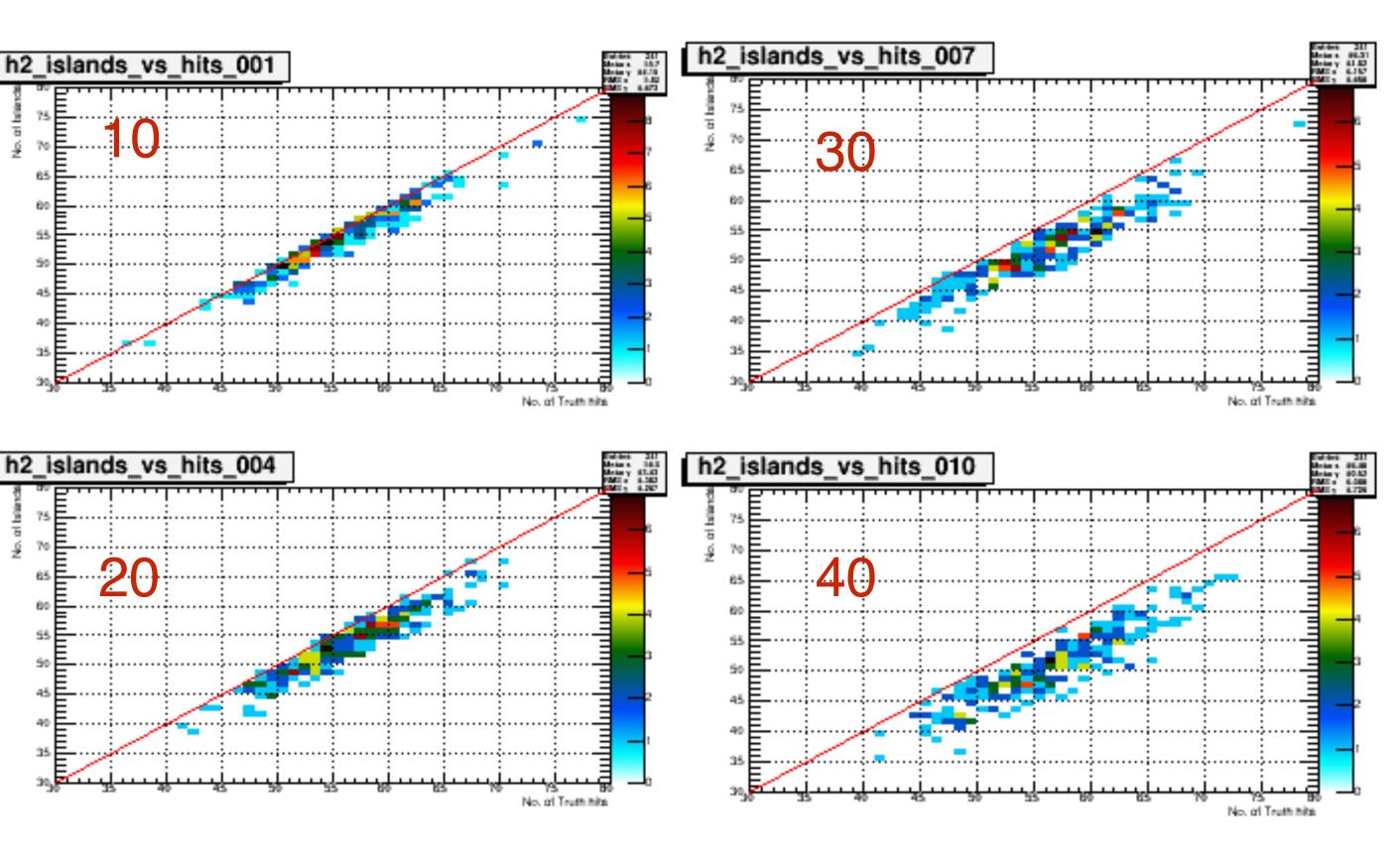


## **Testing With Simulation**

- Two types of simulation used to test DAQ:
  - Online simulation that runs in MIDAS
  - Offline CUDA-based simulation that runs on OSG
- Online Simulation:
  - Fills generated and passed through tcp socket at localhost to AMC13 frontend
  - Truth data saved in separate data bank







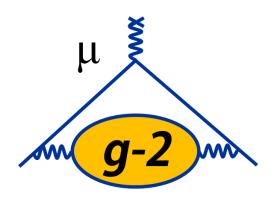
- Detected hits vs truth for four threshold values
- Red line shows slope of 1



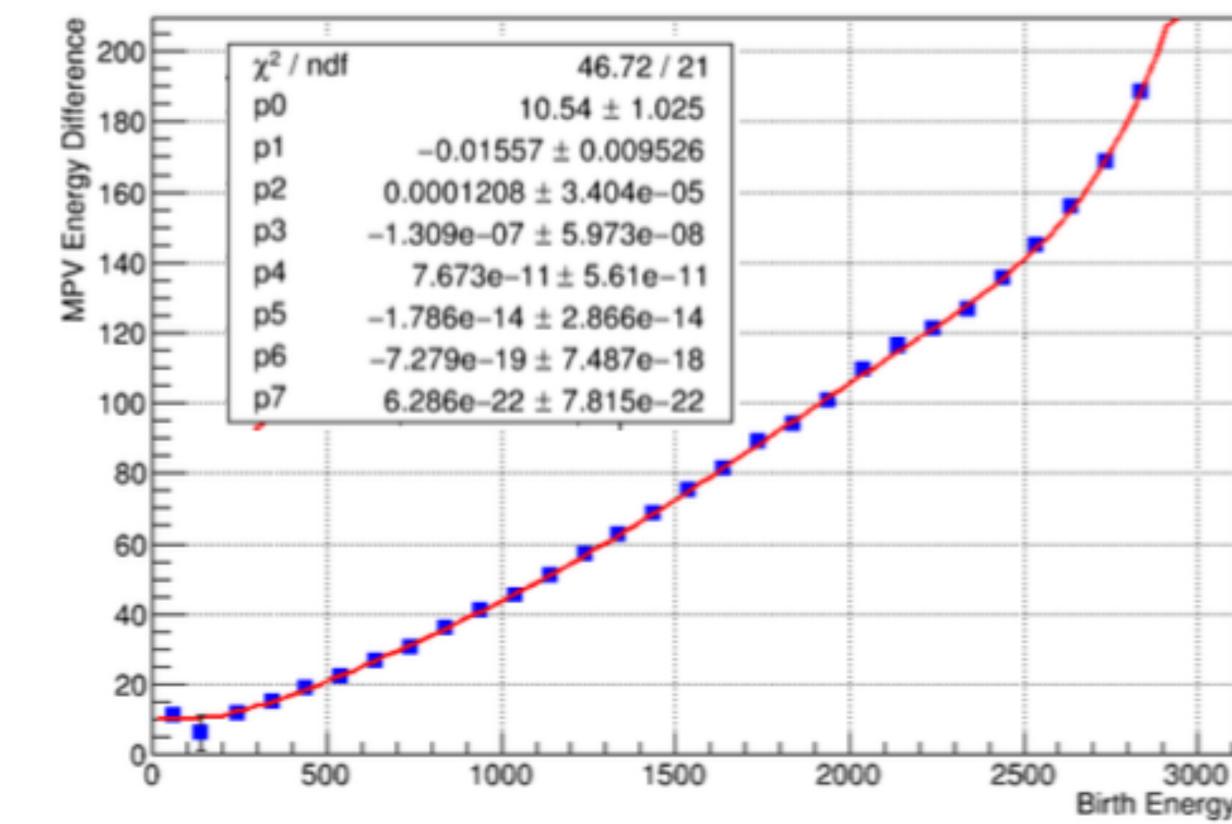


### **CUDA Based Monte-Carlo**

- Cuda-Based Monte Carlo simulation used to test analysis and determine optimum parameters at which to run the data acquisition system.
- Utilizes cuRand to generate Monte Carlo dataset.
- Each fill is generated in a single thread, so many fills are generated in parallel.
- Utilize input from Geant simulation to implement realistic energy, time, and spatial distributions.



Fit of MPVs

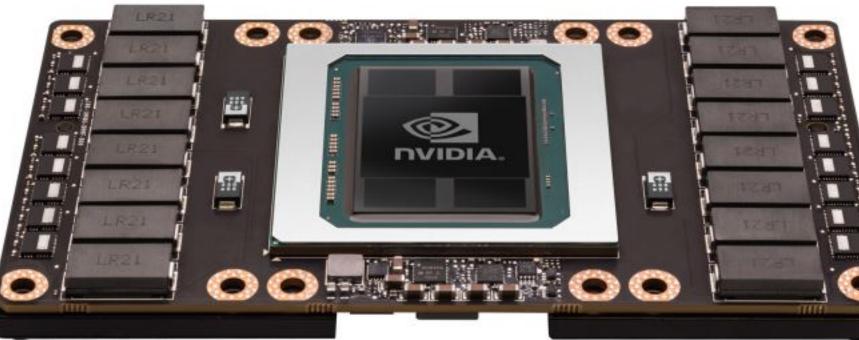




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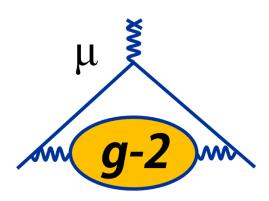
## **GPU Nodes on Open Science Grid**

- Run on Open Science Grid GPU nodes to simulate 10<sup>11</sup> positrons in 2.5 hours.
- Currently running on two OSG sites with GPU nodes:
  - Omaha: Nvidia Tesla P100, 3584 Cuda cores
  - Syracuse Orange Grid: GeForce GTX 750 Ti, 640 Cuda cores
- Must insure that code is optimized for either architecture.



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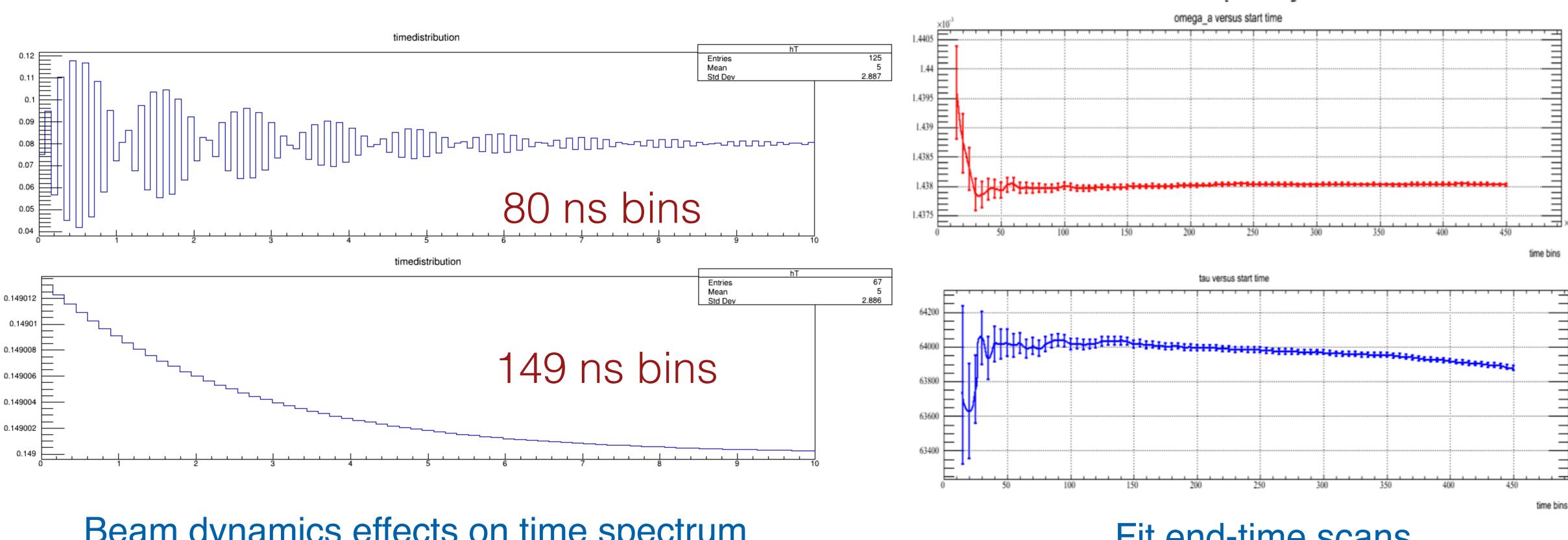






### What we learn from the simulation

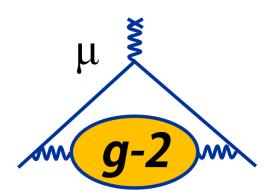
Results of the simulation were used to set DAQ parameters.



Beam dynamics effects on time spectrum

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Fit end-time scans



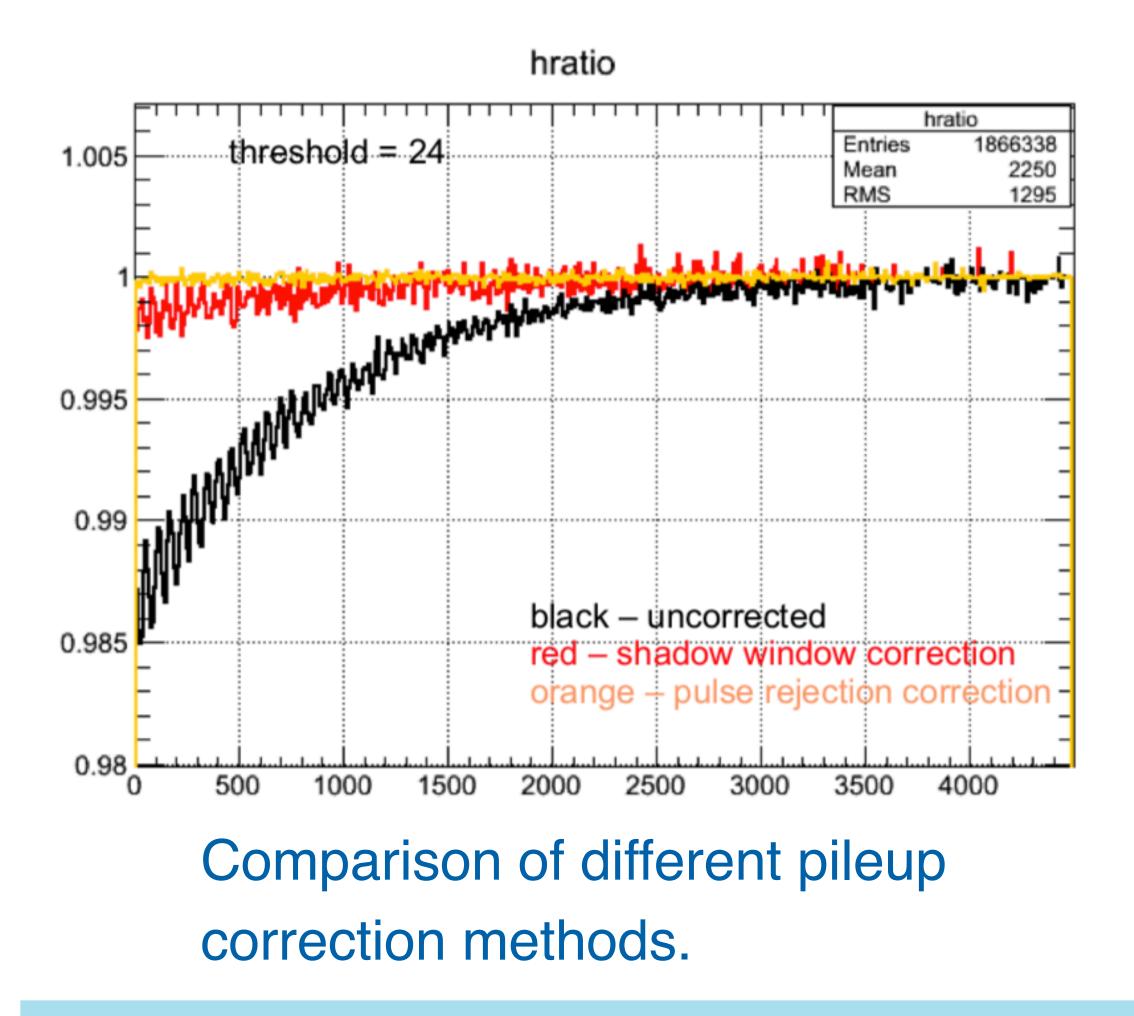
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#### time bins

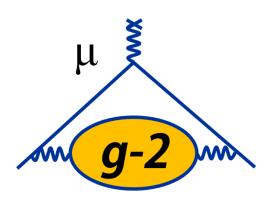
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_	1	-	$\times 10^3$

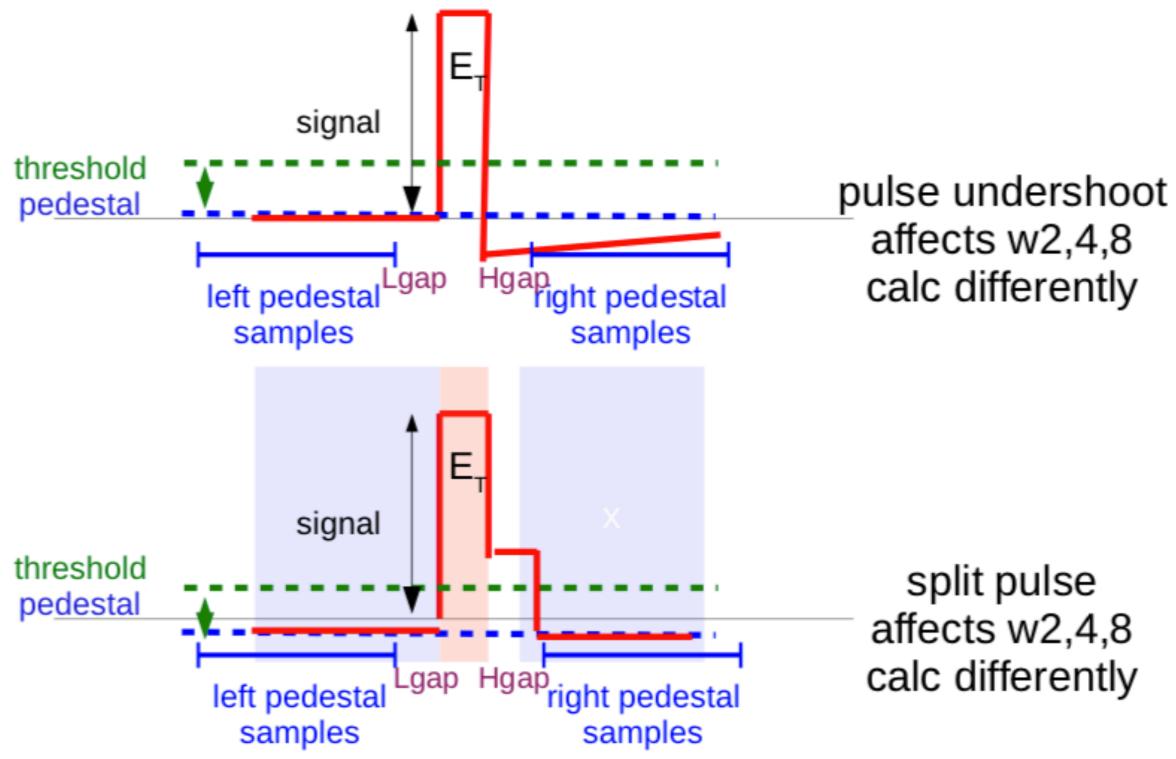
### **Better understanding of systematic error**

Can simulate effects from pileup, pedestal variations, beam effects.



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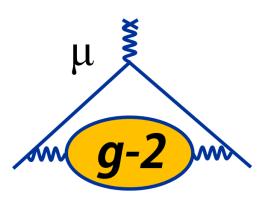


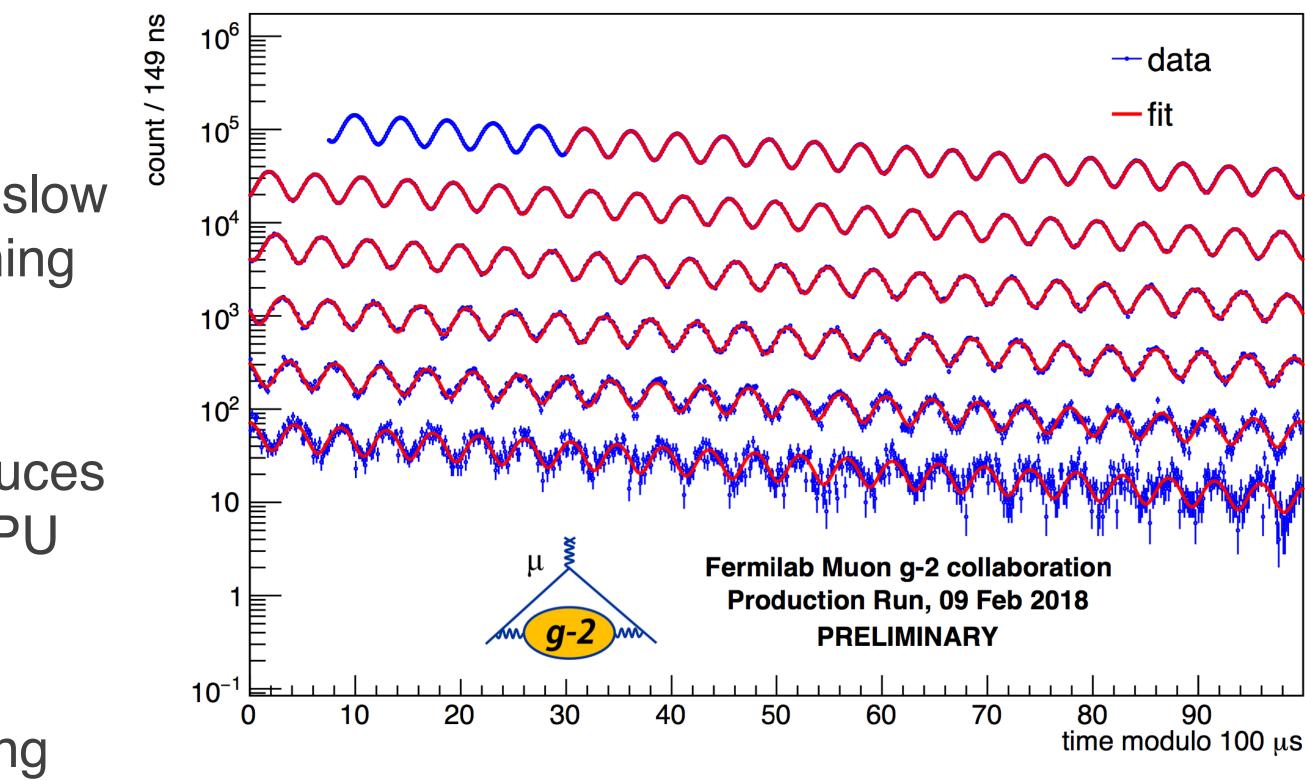




#### **Fast DAQ Summary**

- The DAQ for Muon g-2 at Fermilab has been fully commissioned and is performing well.
- The DAQ hardware includes 17 frontend machines, 5 backend machines, 2 dedicated nearline analysis machines, 3 computers for slow control, 3 servers, and 24 beagle bones running 67 MIDAS frontends.
- Takes an input data rate of 20 GB/s, and reduces that to < 200 MB/s in the event builder via GPU processing and lossless compression.
- DAQ is fully operational and currently is writing data with >5000 positrons per second.

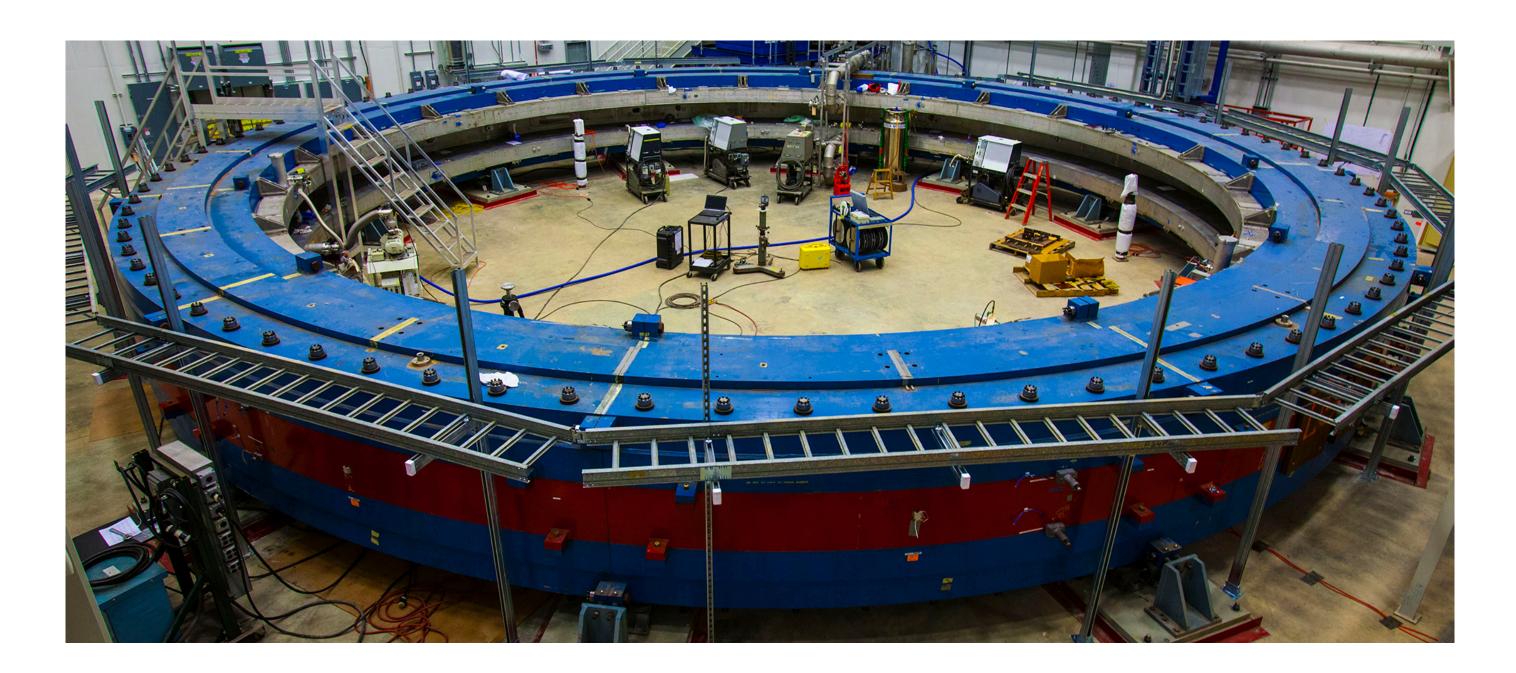




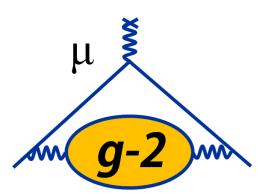


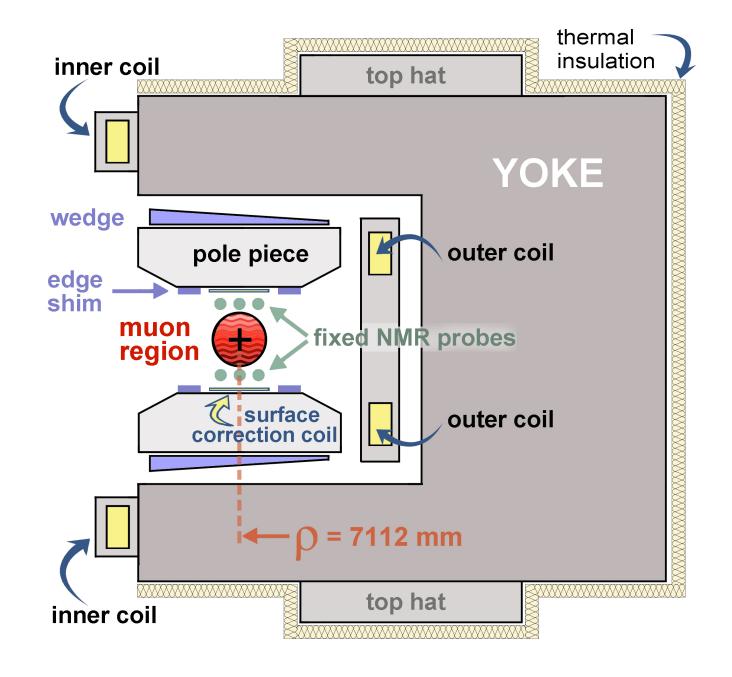
## High-precision measurement of the magnetic field

- Muons are stored in a ring magnet
- Target precision: <70 part-per-billion</li>
- Uniformity requirement: +/-1 ppm cross-section, 100~ppm azimuthal
- Stability requirement: drift within 100s of ppb
- GPU: speed up the online analysis and the field stabilization feedback loop



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## **Transportation and re-installation of the magnet**

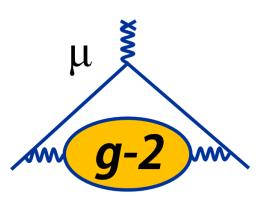








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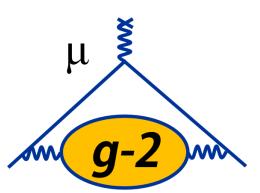




### Transportation and re-installation of the magnet



34 3/21/19 R. Hong (Argonne National Laboratory) I GPUs for DAQ and Simulation in Muon g-2

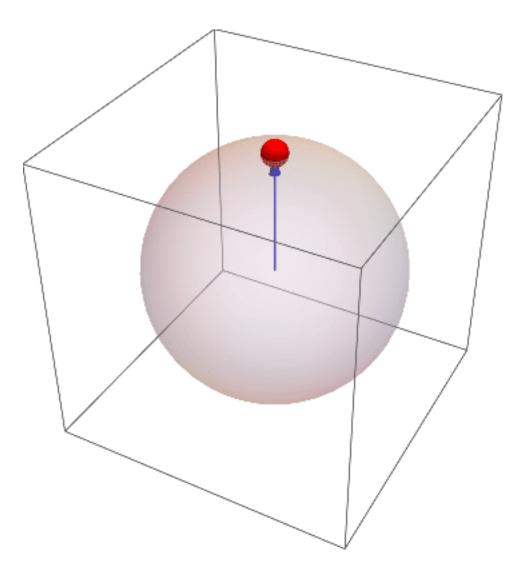




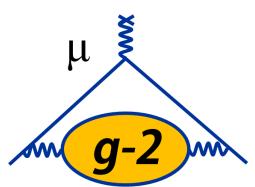


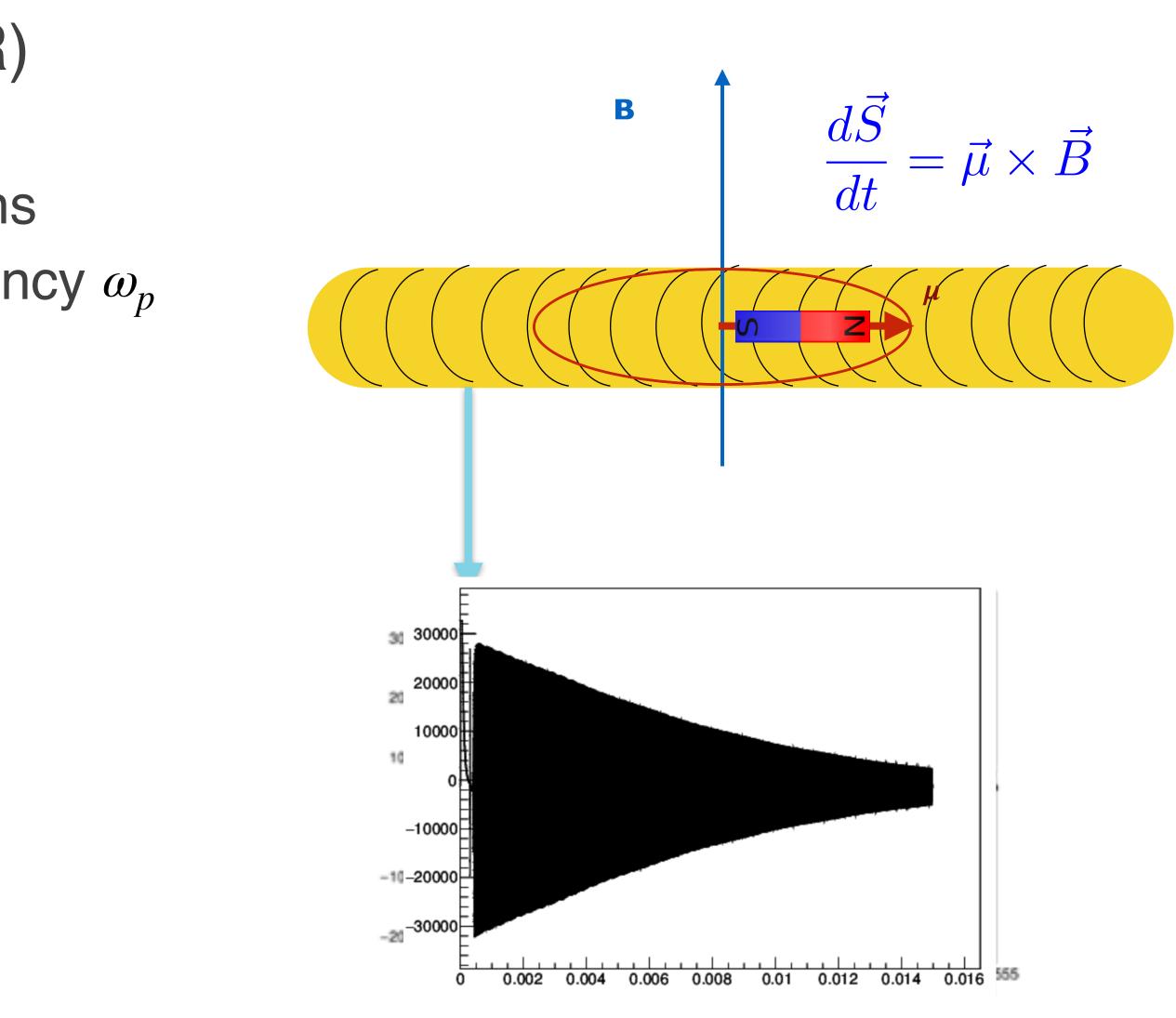
### Measurement principle

- Nuclear Magnetic Resonance (NMR) measurement principle
  - Detecting signals from precessing protons
  - Measure their precession angular frequency  $\omega_p$
  - Signal decays due to relaxation
    - Free Inductor Decay signal (FID)



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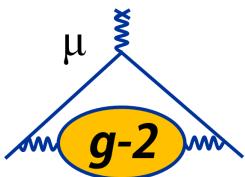


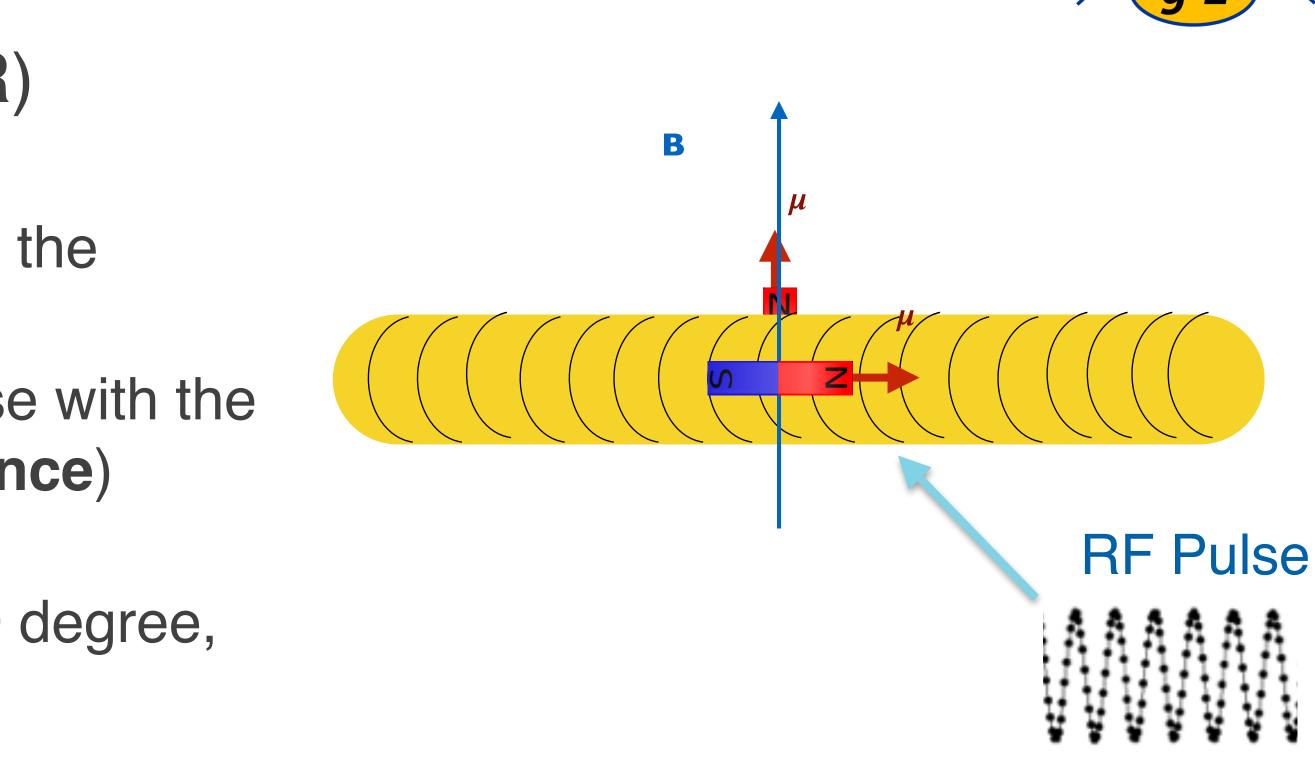




### **Measurement principle**

- Nuclear Magnetic Resonance (NMR) activation principle
  - Protons' magnetic moments aligned with the magnetic field
  - Inject a short Radio Frequency (RF) pulse with the same angular frequency  $\omega_p$  (on resonance) through the coil
  - The RF pulse tips the proton spins by 90 degree, with well-tuned amplitude and duration

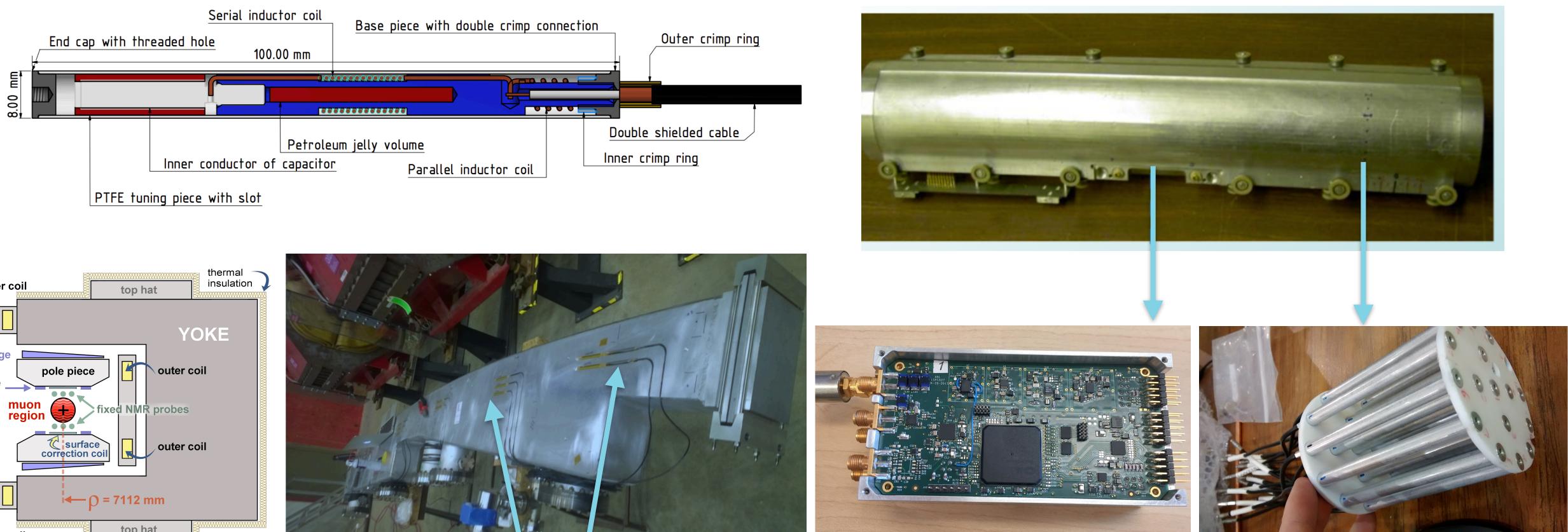


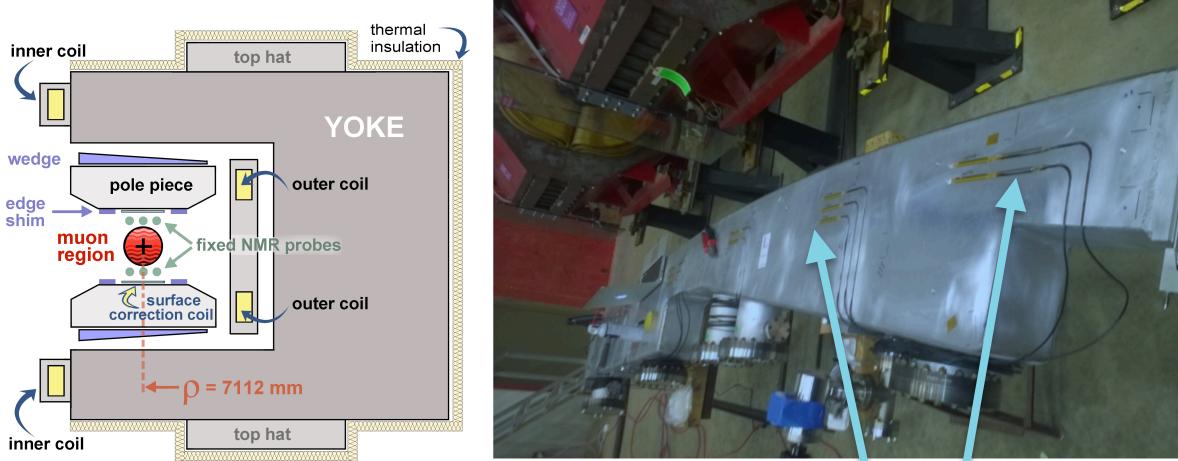




#### NMR probes and devices

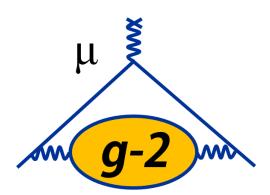
#### **Probe Schematic**





#### Fixed Monitoring Probes (378)

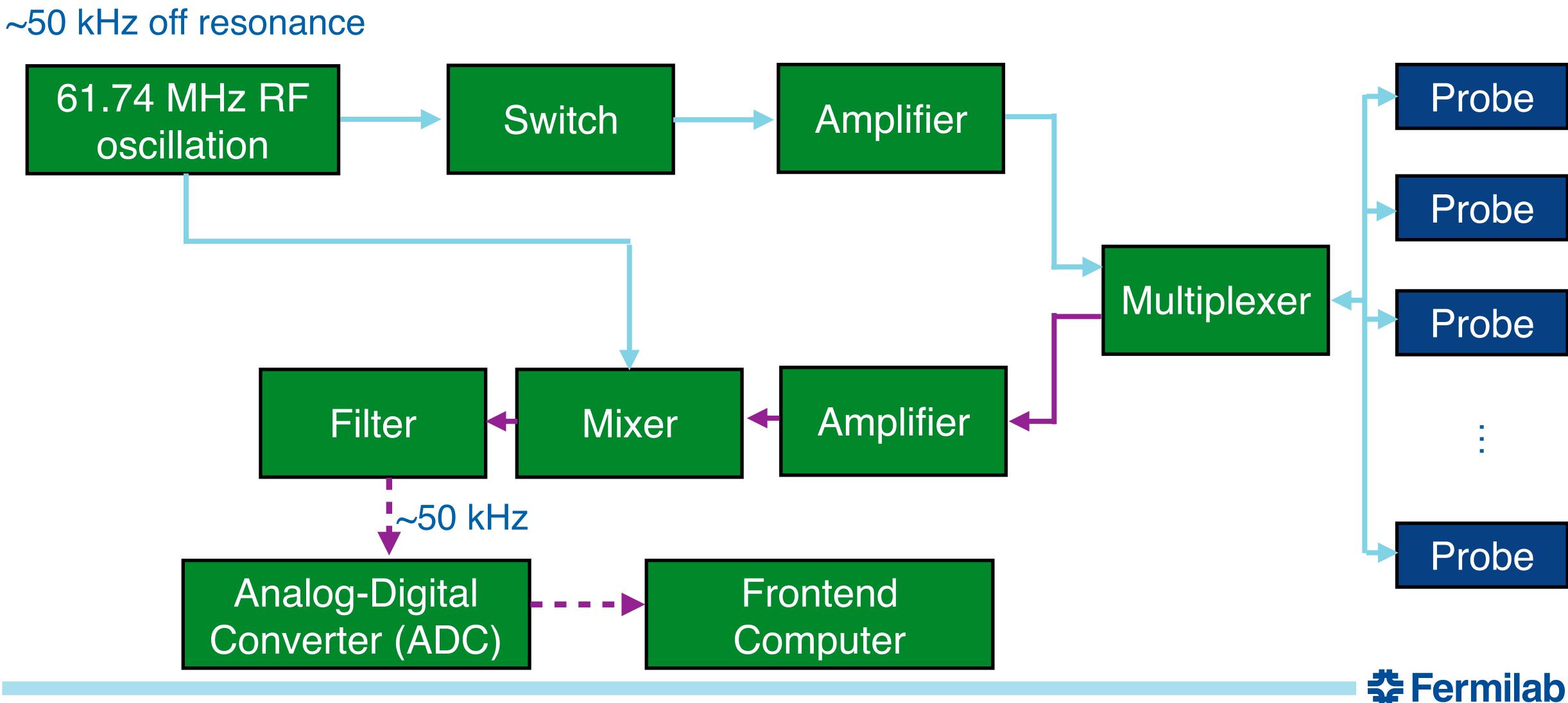
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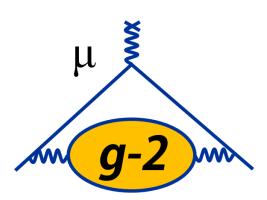
#### Field Scanner



### NMR probe read-out system



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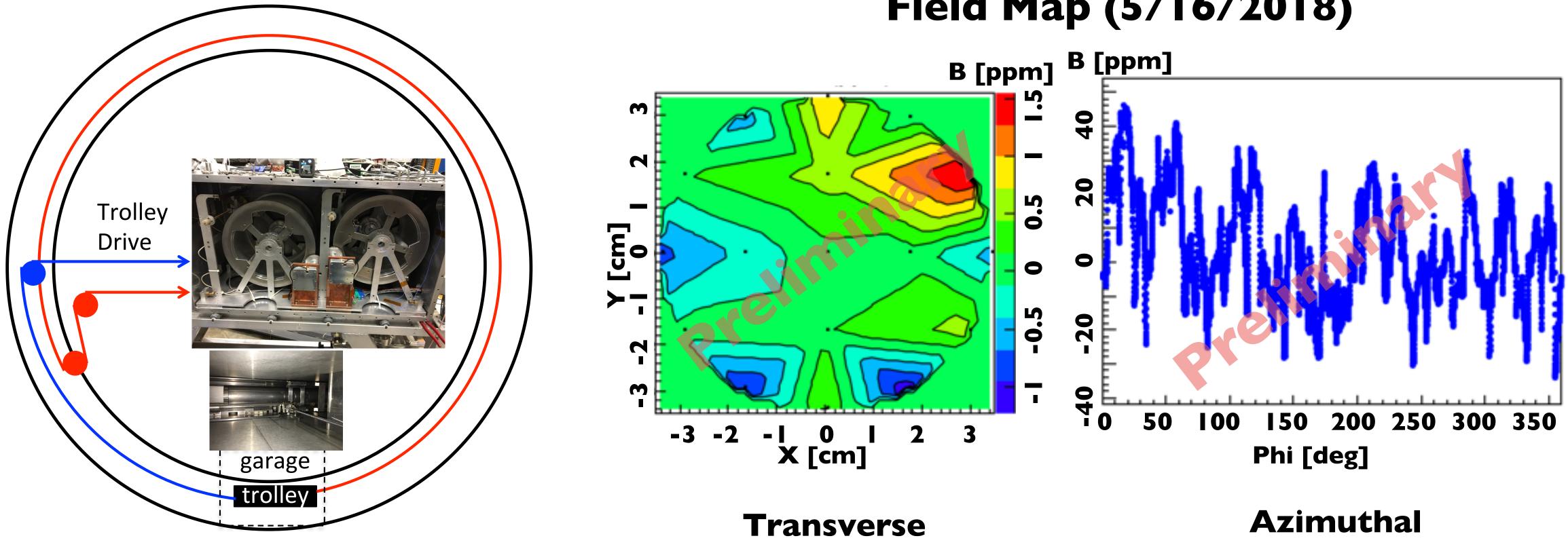




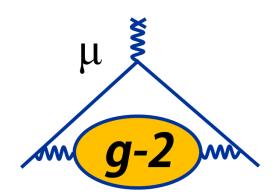




### Scanning the magnetic field



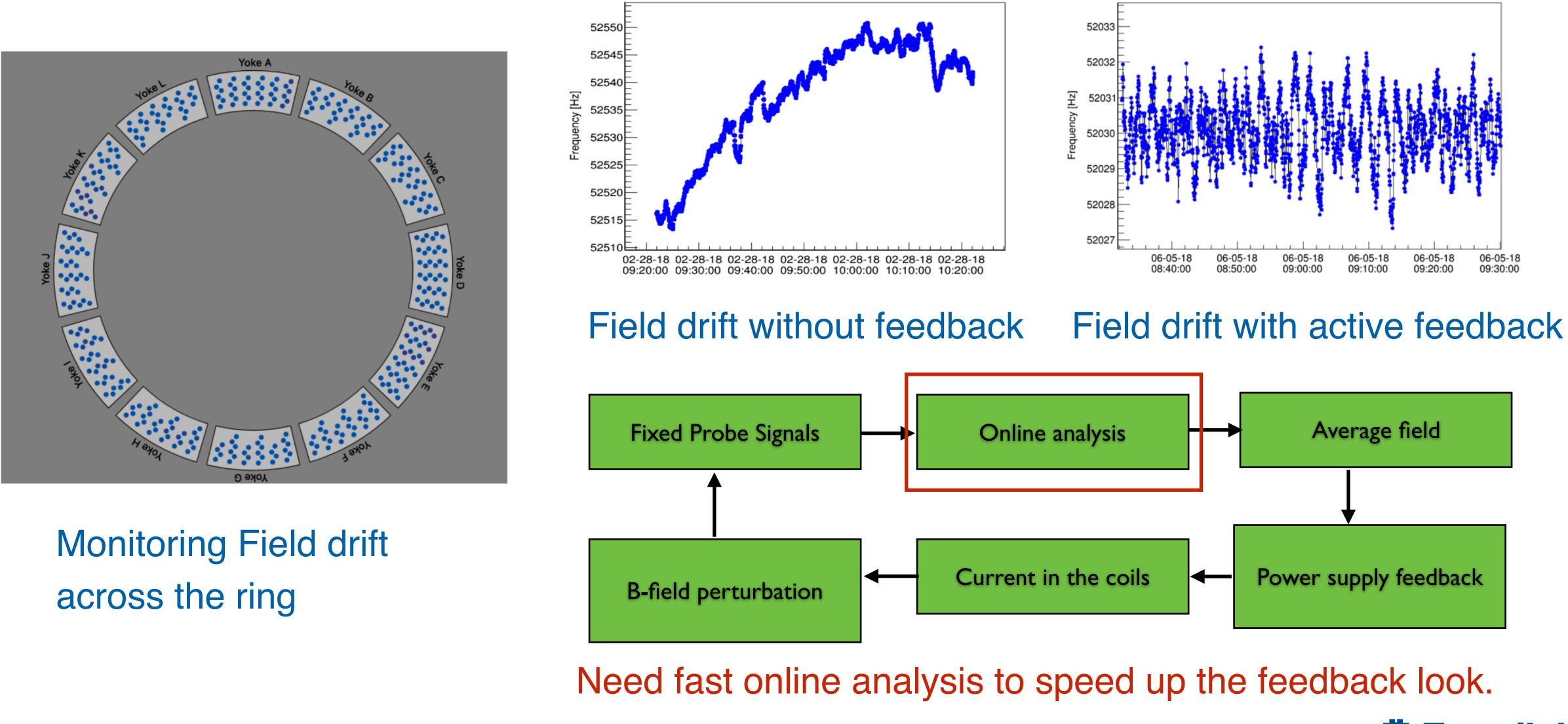
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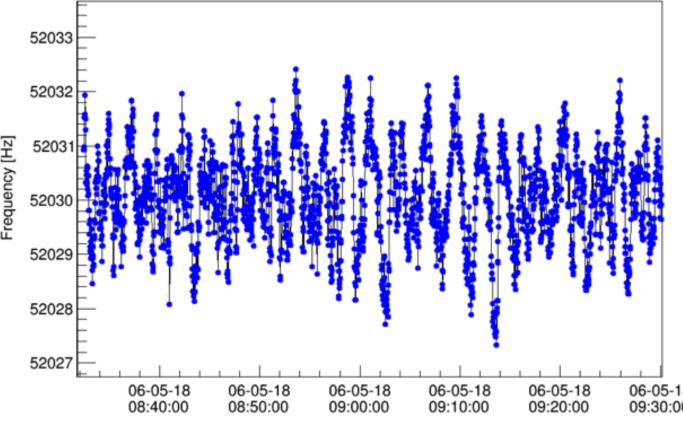




### Magnetic field stabilization



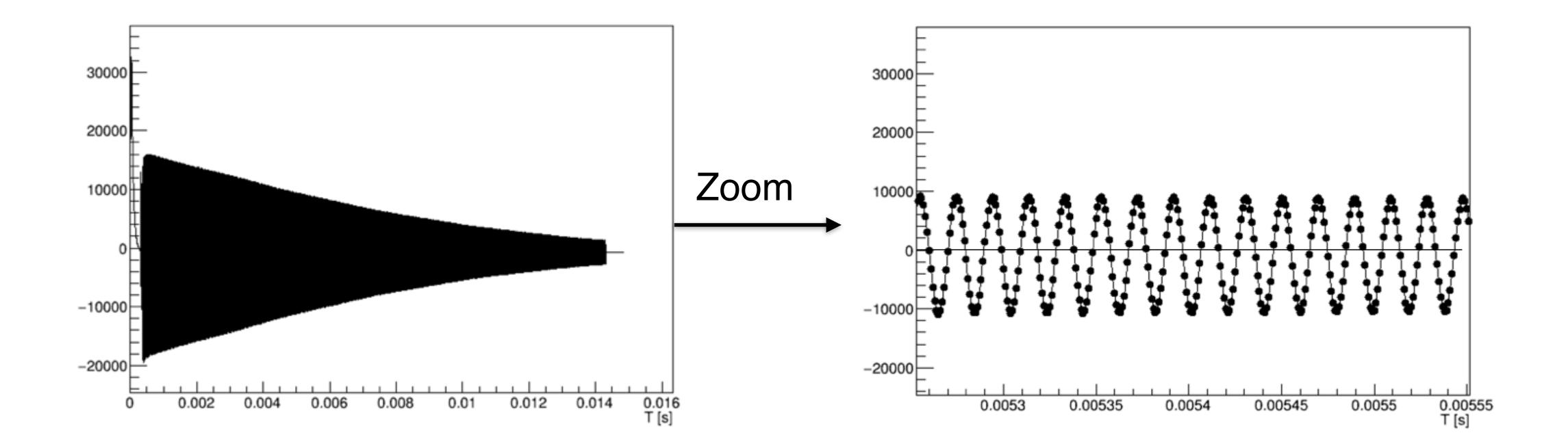
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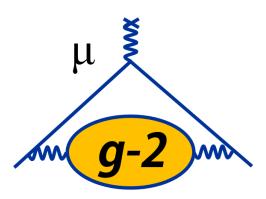




- Basic frequency extraction methods
  - Zero-counting

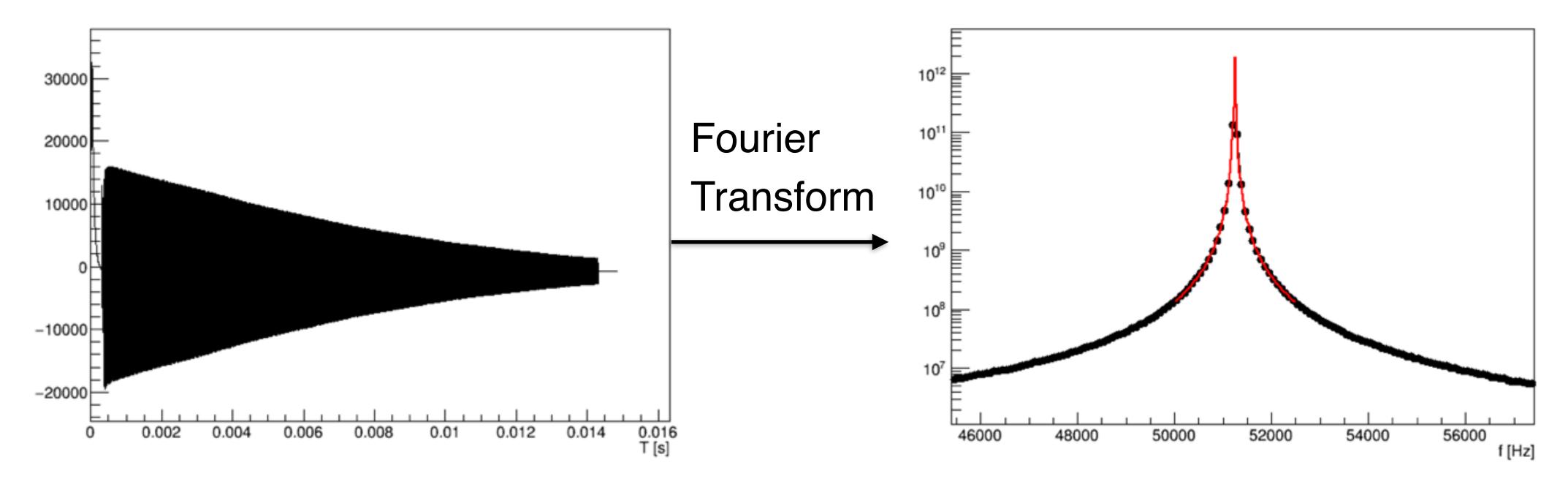


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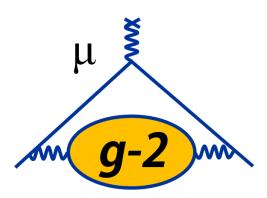




- Basic frequency extraction methods
  - Zero-counting
  - Frequency spectrum fitting/averaging



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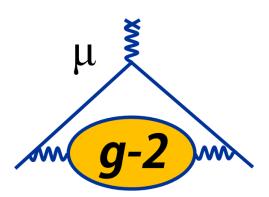


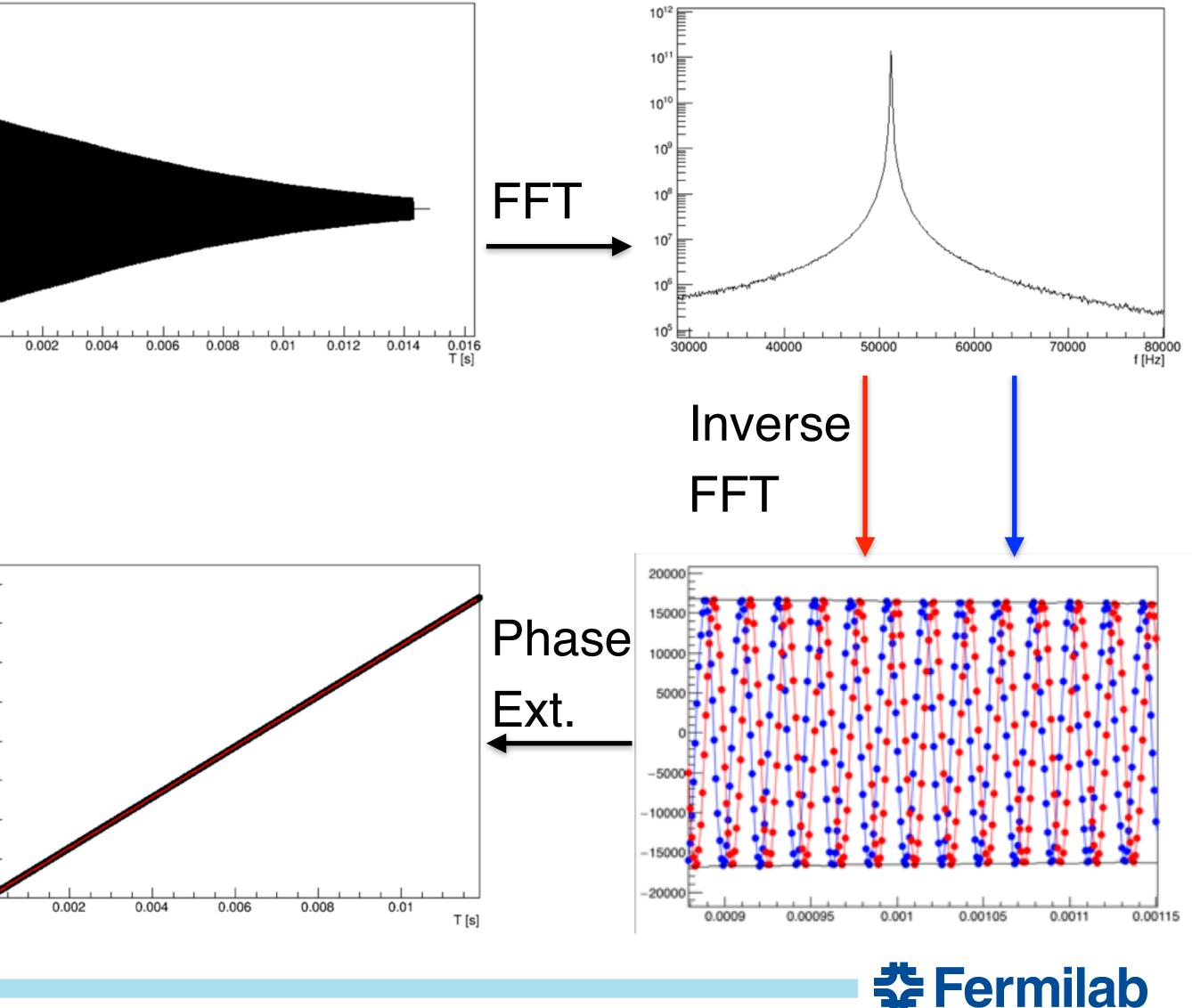
- Advanced frequency extraction methods
  - Hilbert transform and phase fit
    - Signal model:  $A(t)*sin(\omega t+\phi)+baseline$
    - Apply Fast Fourier Transform (FFT)
    - Apply low-pass filter to get rid of the non-zero baseline
    - Inverse FFT ->  $A(t)^*sin(\omega t + \phi)$
    - Multiply the Fourier image by *i* and then inverse FFT ->  $A(t)^* cos(\omega t + \phi)$ 
      - Add in square and take square root: envelope A(t)
      - Divide and calculate tan<sup>-1</sup>: Phase **ωt+φ**



30000

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- Hilbert transform method is time consuming
  - 3 FFTs
  - Power spectrum: absolute value of the complex Fourier image - Envelope calculation: adding squares and calculate square root

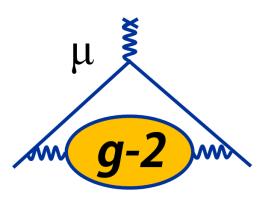
  - Phase extraction: calculating tan<sup>-1</sup>
  - Phase unwrapping: adding  $2\pi$  after each cycle
  - Fit range determination: finding the good range (good signal to noise) for fitting
  - Fit the phase function to a polynomial
  - There are 378 NMR pulses to analyze per measurement cycle
- Goal
  - Analysis time < 1.4s (cycle period of the accelerator)
  - Integrating basic algorithms (zero crossing, frequency spectrum centroid, etc)

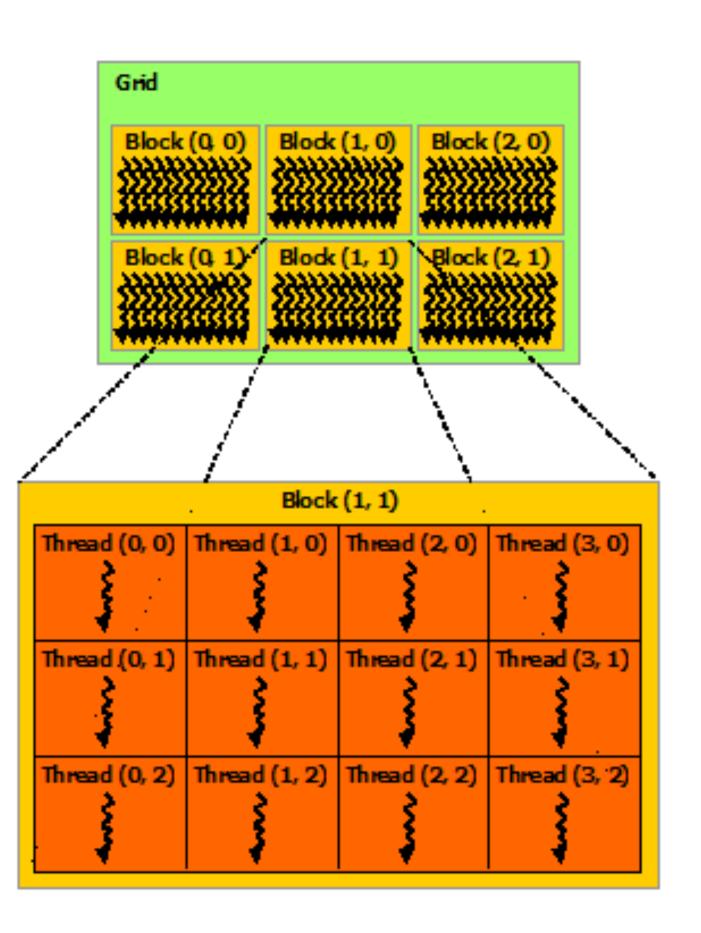




# **GPU acceleration for the NMR analysis**

- GPU can accelerate the analysis
  - GPU is good at performing large quantity of simple operations in parallel
    - Same operations on each vector component
    - Reduction operations
    - Matrix multiplications, solving linear systems
  - CUDA allows user to define GPU kernels
  - Ready-to-use cuda libraries for FFT, thrust, linear solver, etc.







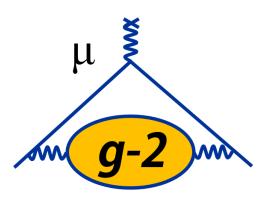


# **GPU acceleration for the NMR analysis**

Acceleration and optimization using CUDA (double precision libraries)

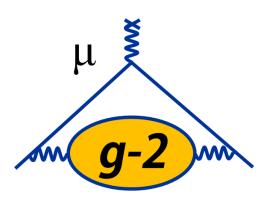
	<b>Event Level</b> <b>Parallelization</b>	<b>Batch Parallelization</b>	Solution
FFT	Yes	Yes	cufft library
Spectrum, Envelope, Phase Extraction	Yes	Yes	thrust library
Phase Unwrapping	No	Yes	customized kernel
Fit Range Finding	No	Yes	customized kernel
Finding Zero Crossings	Yes	Yes	customized kernel
Linear Fit	Yes	No	cublas, cusolverDn
			<b>‡</b> Fermi

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# **GPU acceleration for the NMR analysis**

- Additional considerations for CUDA optimization
  - Reducing coping data between the main memory and the graphic memory
  - Avoid creating objects (like cufftPlan1d) repeatedly
    - The first event takes significantly longer time than subsequent events due to constructing the utility objects
  - threshold to execute GPU-version functions
- Code management
  - Developing CPU and GPU versions of the same function together, and cross check the results. Keep the interfaces the same.
  - Compile analysis functions and classes to shared libraries, and then link them to the DAQ frontend and the off-line analysis.
  - Switching between CPU and GPU versions by environmental variables at the compile time.



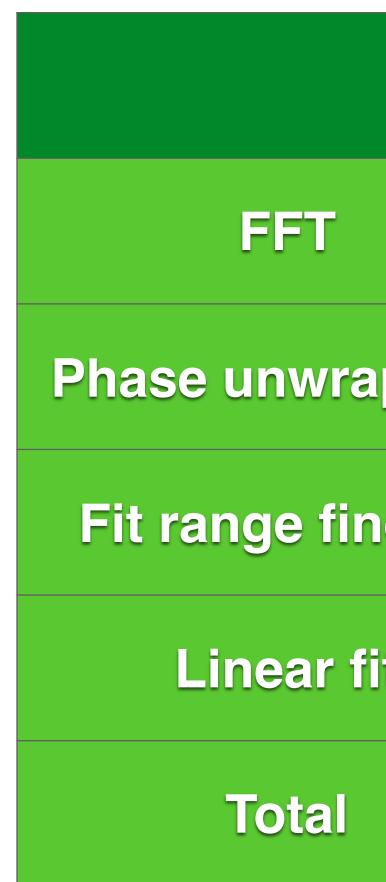
# - For small data set, GPU is not necessarily faster than CPU: setting a batch size

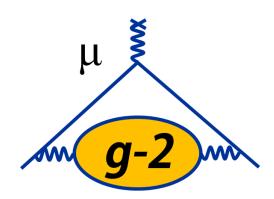




### **Performance comparison**

- 1 GPU
- 378 pulses
- 4096 samples per pulse (decimated waveforms for offline analysis)
- 1st event is not included
- No improvement!





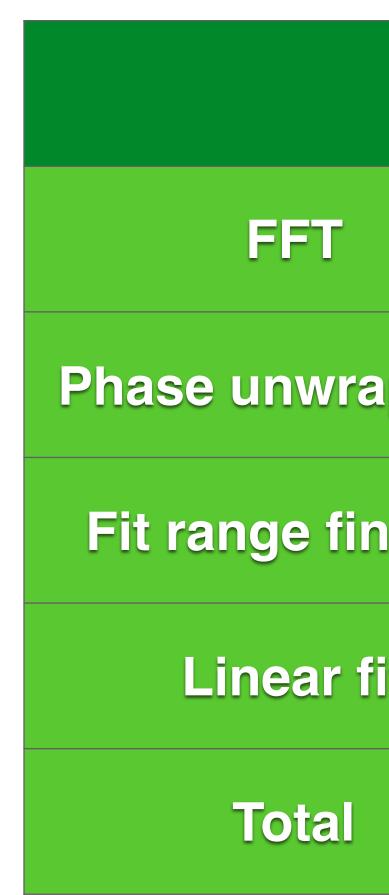
	CPU (Xeon E5 1630)	GPU
	235 ms	186 ms
apping	2.82 ms	<b>2.80 ms</b>
nding	<b>4.80 ms</b>	<b>4.54 ms</b>
it	186 ms	261 ms
	431 ms	469 ms

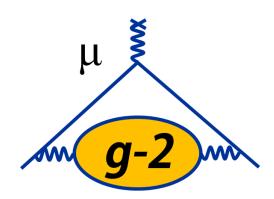




### **Performance comparison**

- 1 GPU
- 378 pulses
- 40960 samples per pulse (raw waveform for online analysis)
- 1st event is not included
- GPU wins! CPU algorithms cannot meet the specification.
- The GPU algorithms can be faster by employing batch matrix operations after CUDA 9.1





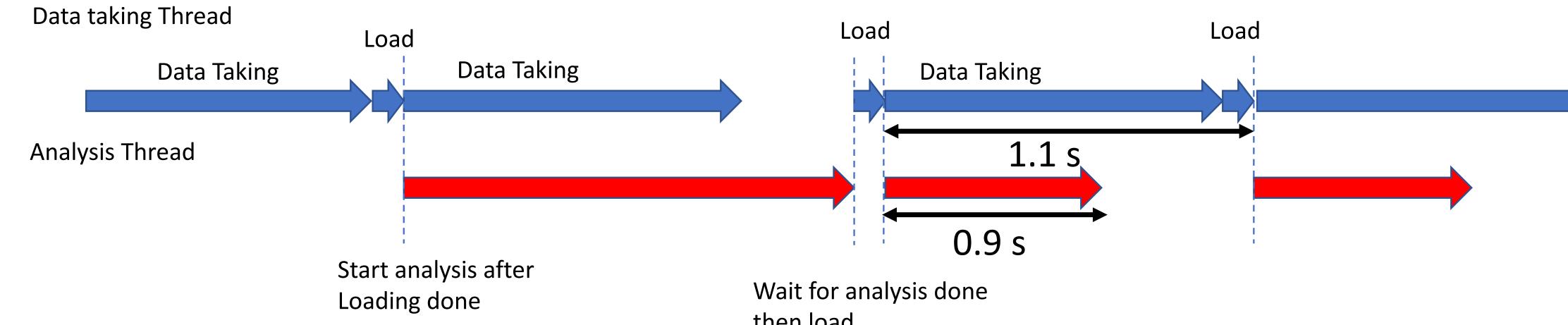
	CPU (Xeon E5 1630)	GPU
	2.73 s	338 ms
apping	28.0 ms	24.7 ms
nding	47.3 ms	42.9 ms
it	1.14 s	<b>489 ms</b>
	3.96 s	940 ms





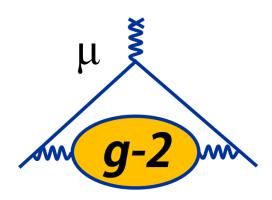
### **CPU thread-level optimization**

- The data taking takes ~1.1 s
- processing time < 1.4 s
- Synchronized parallelism



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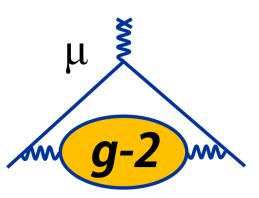
#### Data taking and analysis have to be in parallel threads to achieve total data

then load



# Summary of the magnetic field measurement

- The magnetic field for the muon storage ring in the Muon g-2 experiment is measured by NMR probes.
- Magnetic field is stabilized by a feedback system
- Fast online analysis method is needed to speed up the feedback loop in order to achiever better field stability
- GPU processing speeds up the online frequency extraction by a factor of 4 comparing to pure CPU processing
- With the synchronized parallel scheme, the total processing time (data taking + analysis) for each measurement cycle is 1.1 s. Dominated by data taking time.

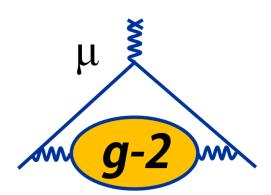




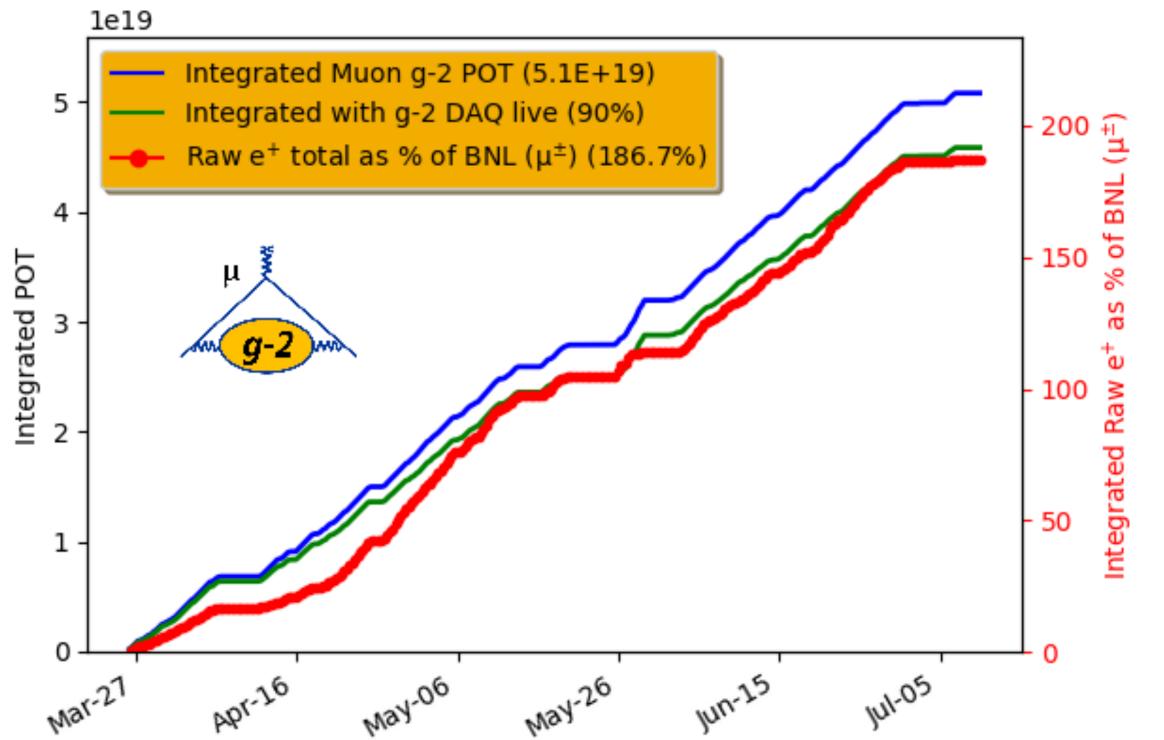


#### **Experiment status update**

- Run 1 was successfully done in 2018
- Data analysis is still on-going
- Run 2 is commissioning



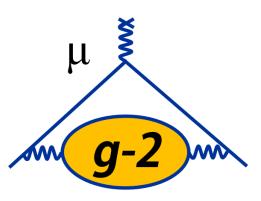






### Conclusion

- Carlo simulations
  - Data reduction
  - Speed up the online analysis to keep the magnetic field stable



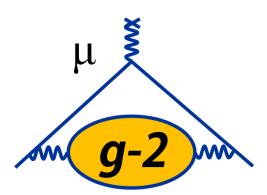
#### GPUs are used in the Muon g-2 experiment for data processing and Monte







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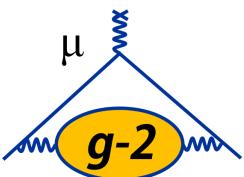
#### Backup

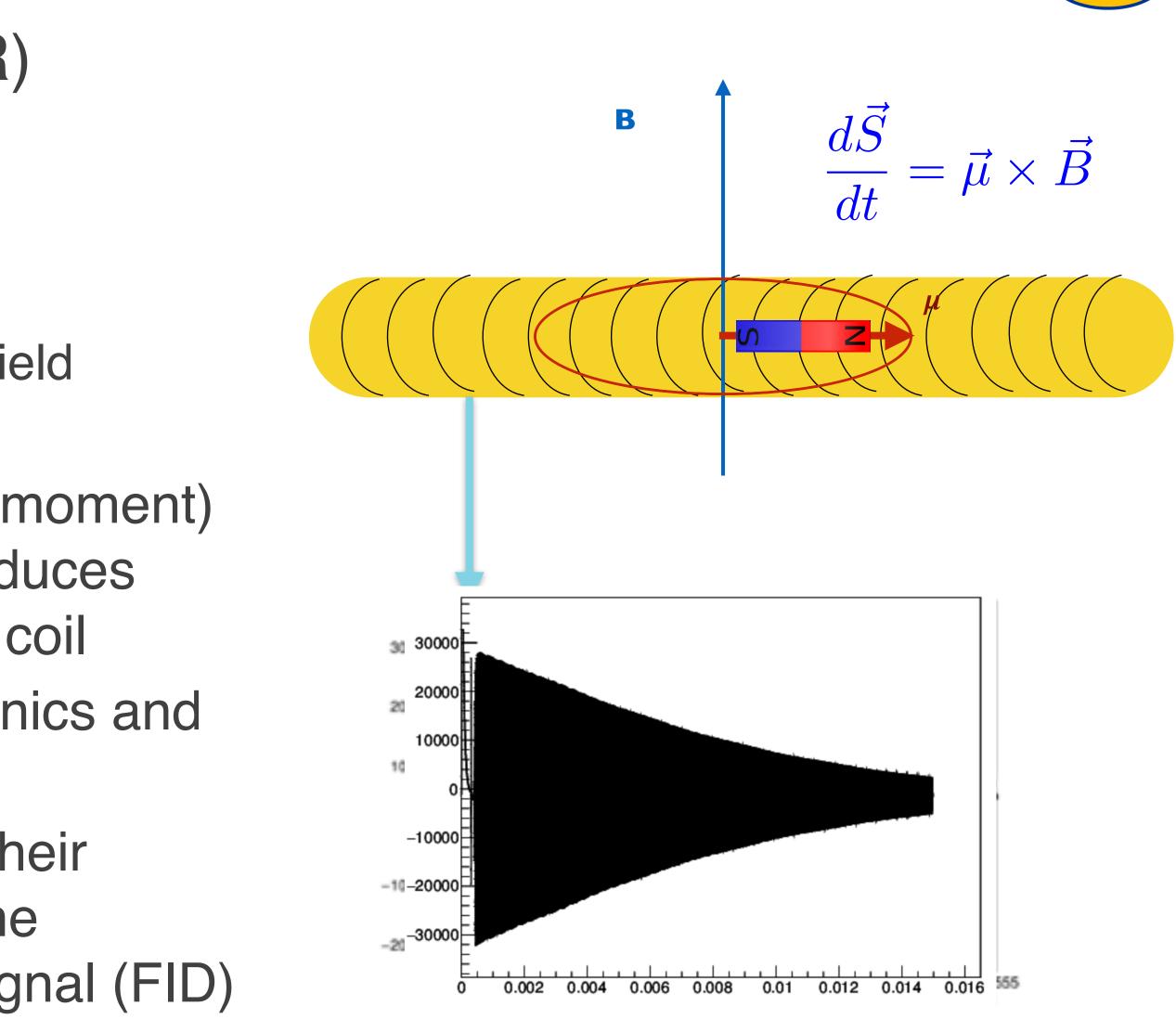




### **Measurement principle**

- Nuclear Magnetic Resonance (NMR) measurement principle
  - Protons have a magnetic moment.
  - The motion of proton spin:
    - Precession around the external magnetic field
    - Precession angular frequency  $\omega_p$
  - Precession of the proton spin (magnetic moment) creates a rotating magnetic field, then induces electromotive force (EMF) in the pick-up coil
  - EMF is amplified and read out by electronics and then recorded
  - Eventually the protons lose energy and their magnetic moments are re-aligned with the magnetic field — Free Inductor Decay signal (FID)

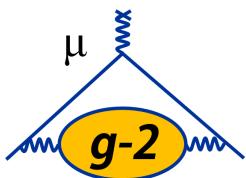


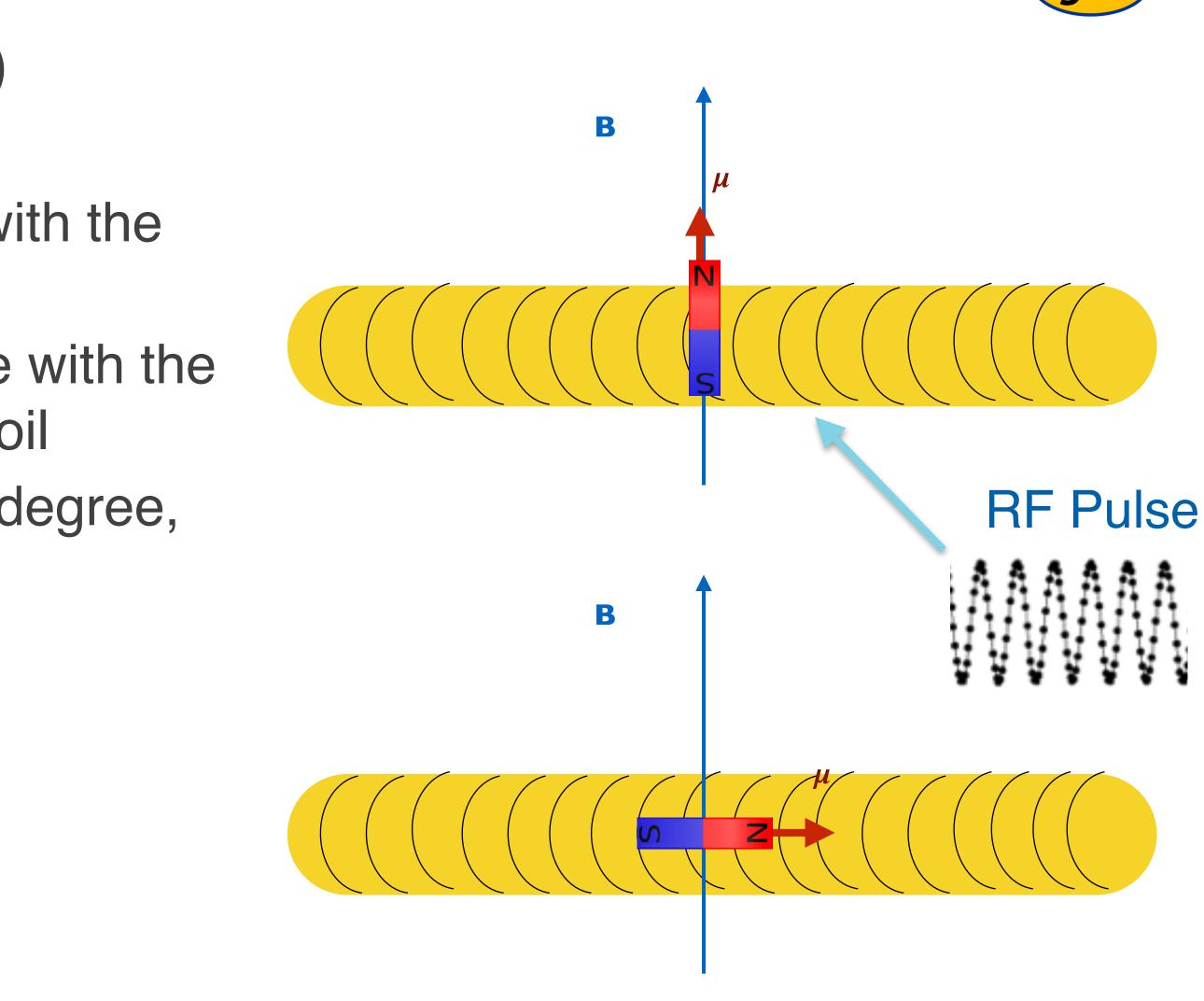




### **Measurement principle**

- Nuclear Magnetic Resonance (NMR) activation principle
  - Protons' magnetic moments are aligned with the magnetic field
  - Inject a short Radio Frequency (RF) pulse with the same angular frequency  $\omega_p$  through the coil
  - The RF pulse tips the proton spins by 90 degree, with well-tuned amplitude and duration



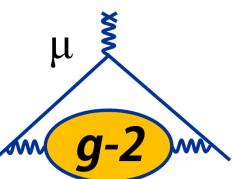


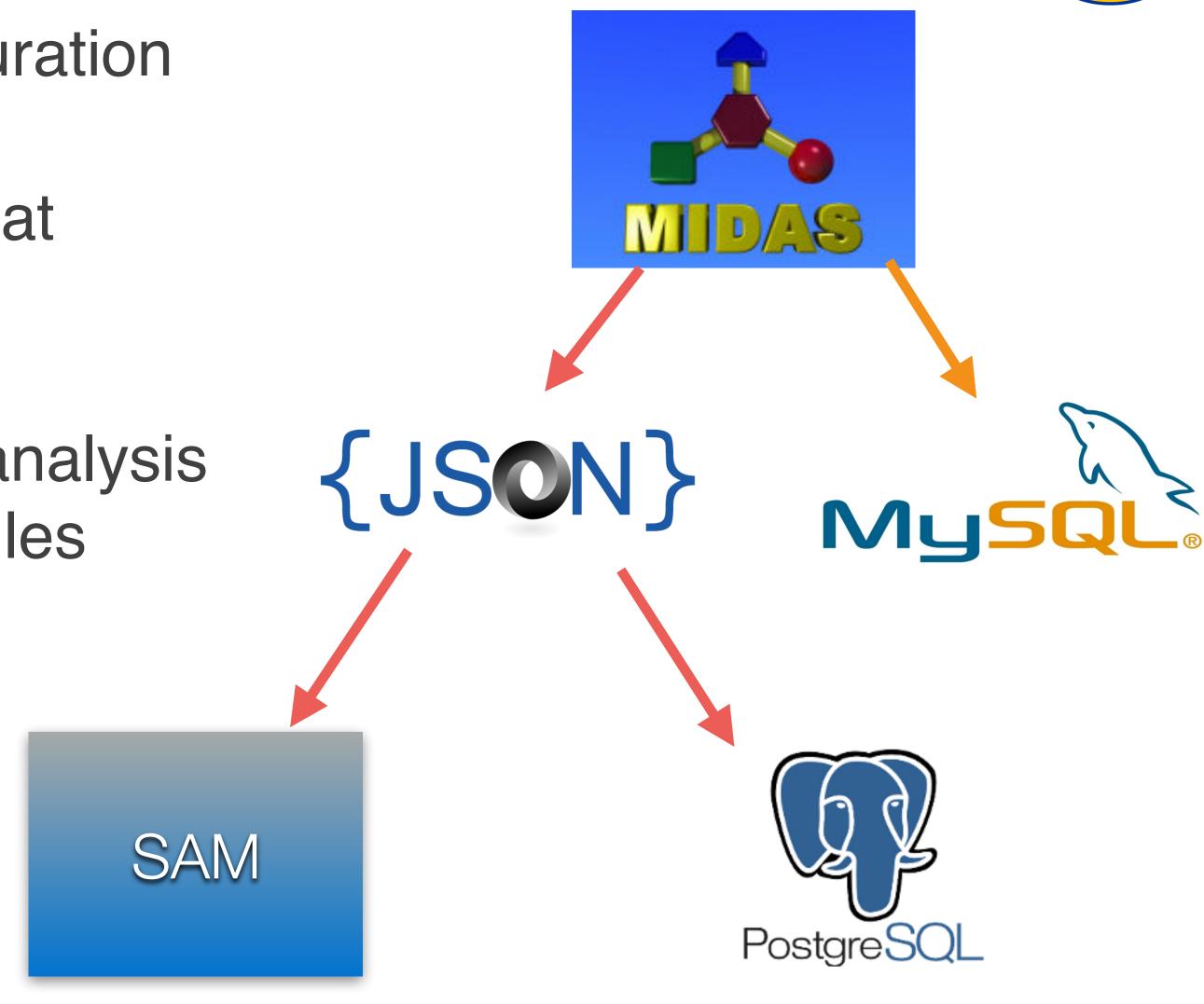


#### **Online State Database Archive**

- At each end of run, the DAQ configuration is dumped to a JSON file.
- A python routine is then executed that imports the entire JSON file into a PostgreSQL database.
- Metadata that is used in the offline analysis is also extracted from these JSON files using python plugins.



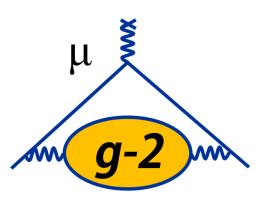




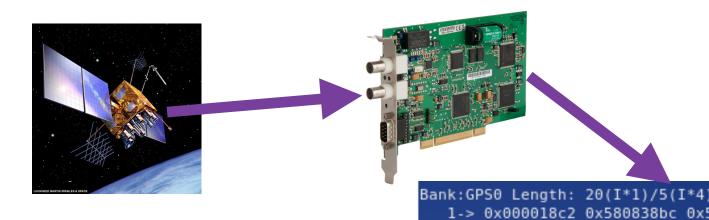


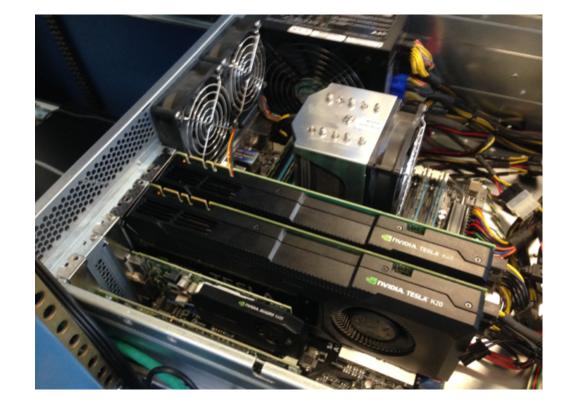
#### **MIDAS Frontends**

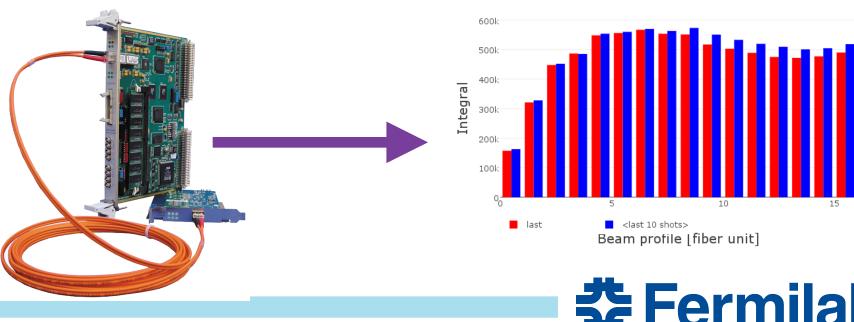
- Master:
  - Communicates with other frontends with RPCs, sets up CCC, and writes GPS timestamps from Meinberg GPS unit.
- AMC13 frontend:
  - Main frontend for processing data from calorimeters, laser, fiber harps, quads, and kickers.
  - Processes the data with Nvidia Tesla K40 GPUs
- Tracker frontend:
  - Data comes from multihit TDCs that are read via FC7 cards.
- IBMS frontend:
  - Data from the inflector beam monitoring system (IBMS) is read out via a CAEN digitizer.











**IBMS 1 X Profile** 

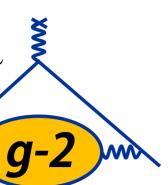
**Fermilab** 



### **Contributing Institutions and Responsibilities**

Institution	Responsibilities	Personnel					
University of Kentucky	AMC13 Readout, GPS, DAQ Hardware, IFIX integration, Online Systems Management	PI + PD (on site) + GS (on site)					
University College London	Tracker readout, Online Management	PI (on site) + PD (on site) + GS (on site)					
University of Washington	DQM, IBMS readout, Field, Nearline	GS + 2x GS + PD					
Northern Illinois University	Slow controls	PI					
Argonne National Lab	Field DAQ	PD (on site)					
JINR, Dubna	Web interface, Event display	2x Scientist					
Novosibirsk	Django Web Display	PD					
University of Michigan	Field	GS					
Shanghai	Database management	PD	~24 total				
Italy (Frascati + Napoli)	Laser system integration	PI + <mark>PD (on site)</mark> + PD + GS	RED = DAG				
Cornell	Auxiliary detector integration, Clock	PD + GS (on site)					
Fermilab	Beamline integration	Scientist					

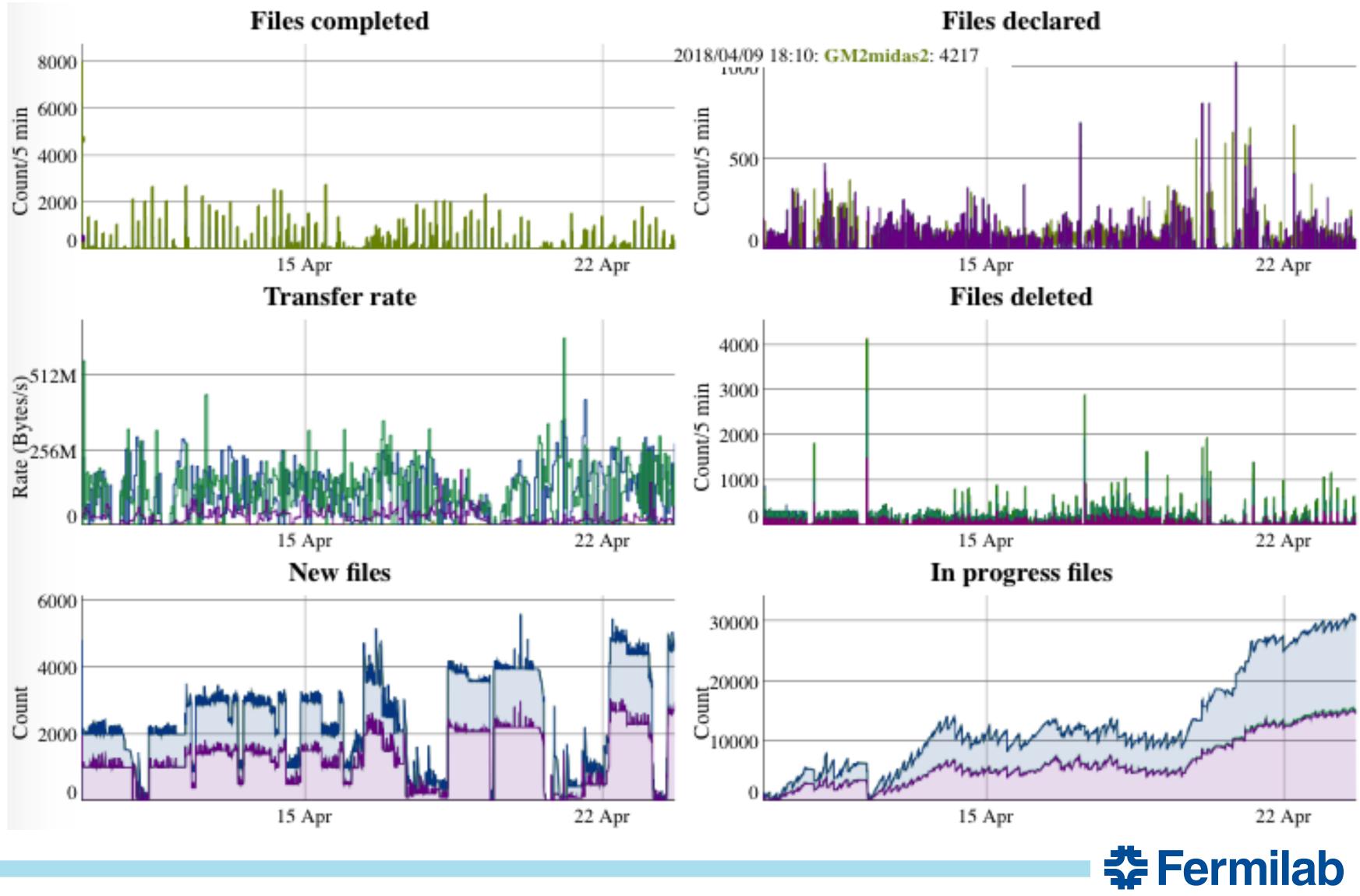


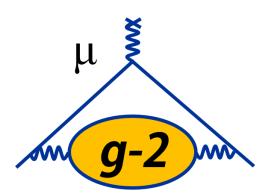




# **File Handling**

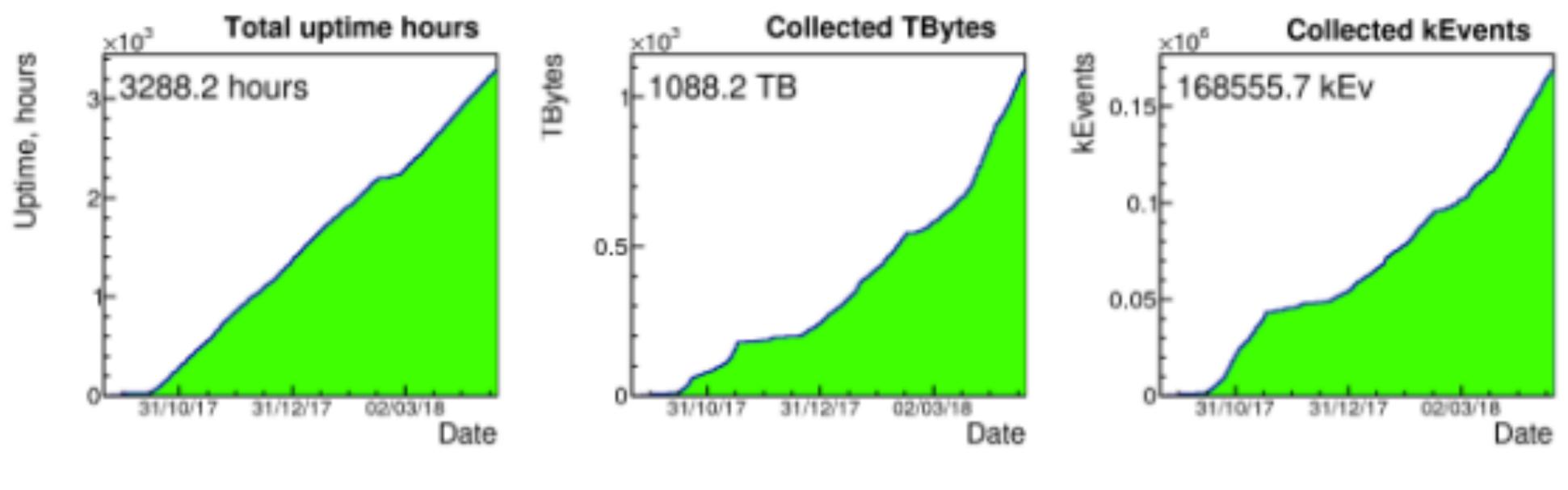
- Writing 100 TB of data to tape per week.
- 70 TB local RAID keeps copy of data until it receives a tape label.
- File transfers are handled with Fermi File Transfer Service and catalogued with SAM.



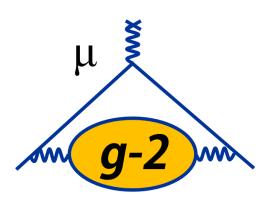


#### **DAQ Performance**

- DAQ is currently running well and writing 200 MB/s to tape.
- Uptime averages better than 90%.
- spares.



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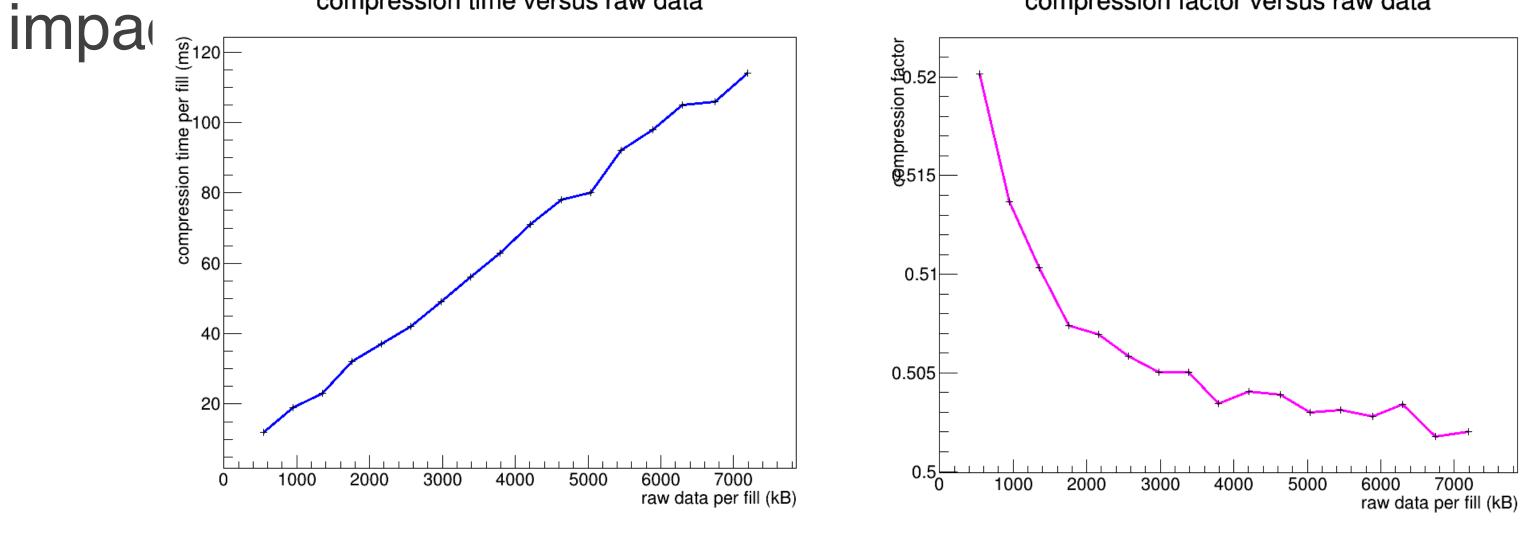
#### During past 11 months only two hardware outages that were handled by hot

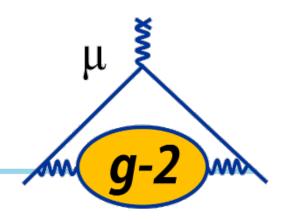




#### **Data Compression**

- We are compressing the data using the zlib libraries in each of the frontends.
- The frontend compresses all banks into one compressed bank, which is unpacked later in an art input module.
- We achieve a factor of 2 compression without any significant

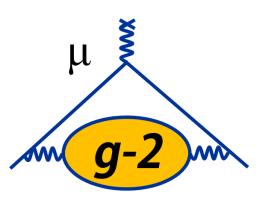






#### Input sources

- Digitization is performed in custom uTCA based waveform digitizers. Each digitizer runs at 800 MSPS, so each time bin is 1.25 ns, and a 700 us fill
- is 560,000 clock ticks.
- Each uTCA crate contains 12 WFD5s or 60 channels of digitization.
  - Crate 0 reads data from the clock and control center (CCC)
  - Crates 1-24 each read data from one calorimeter (+ spare channels)
  - Crate 25 reads data from the laser system
  - Crate 26 reads data from the Auxiliary detectors (Harps, Quads, and Kickers)
  - Crate 27 reads data from the three tracker detectors.
- Data from each crate is sent to a DAQ computer via a dedicated 10 Gb fiber. The total data rate is 20 GB/s.
- The data is then processed in Nvidia K40 GPUs.

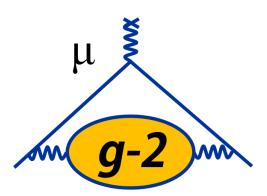






### g-2 Detector Systems

- 24 Calorimeters
  - 1 uTCA crate for each calorimeter
  - 54 channels \* 24 calos = 1296 channels of digitized data.
  - Data provided by 12 Cornell waveform digitizers.
- 4 Fiber Harps
  - 7 channels \* 4 harps = 28 channels
  - Data provided by Cornell waveform digitizers
- Quads and Kickers
  - Write 4 quad channels and 15 kicker channels
  - Data provided by Cornell waveform digitizers
- 3 Trackers
  - Data from Multihit TDCs sent from FC7s in a uTCA crate
- IBMS and quads
  - Running on CAEN digitizers
- Slow control SCS3000 devices





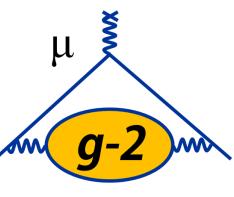




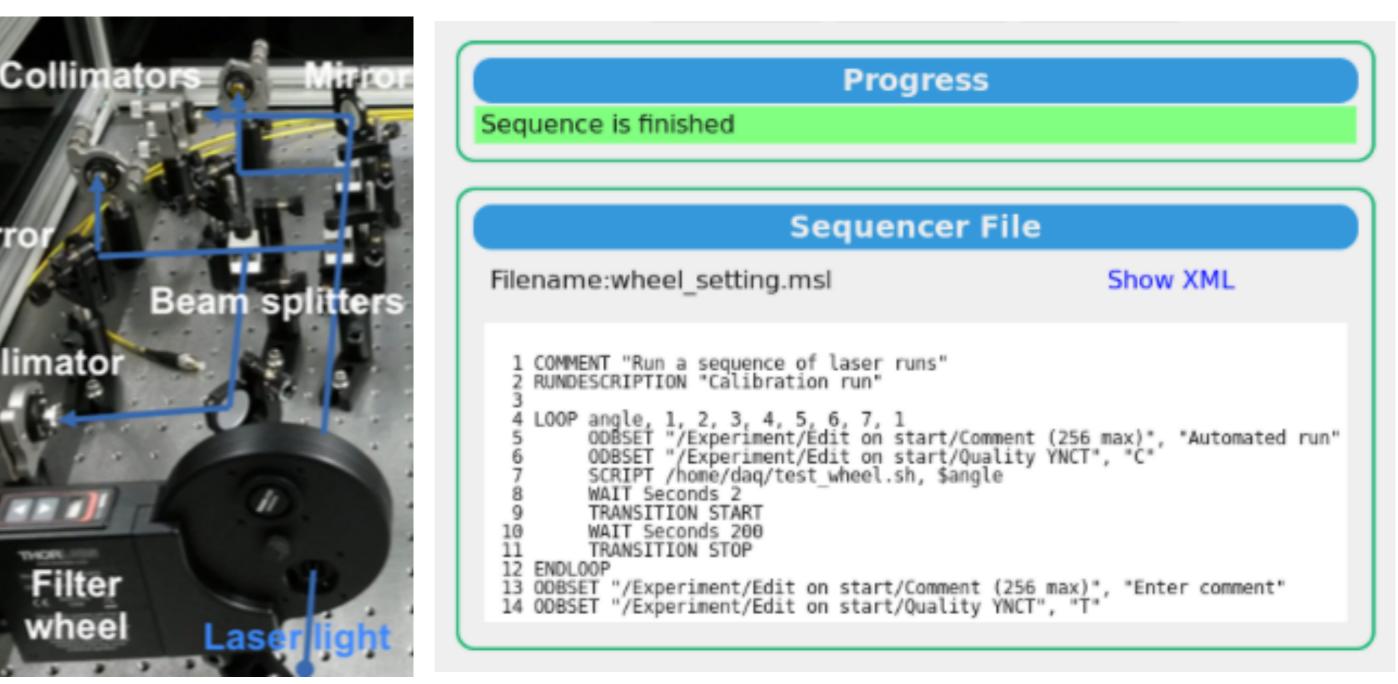
### **MIDAS Sequencer**

- scans and bias voltage scans.
- A typical sequence would be:
  - Execute script to move wheel.
  - Update ODB values
  - Take data for 10 minutes
  - Repeat





#### The sequencer was used extensively for calibration runs such as filter wheel

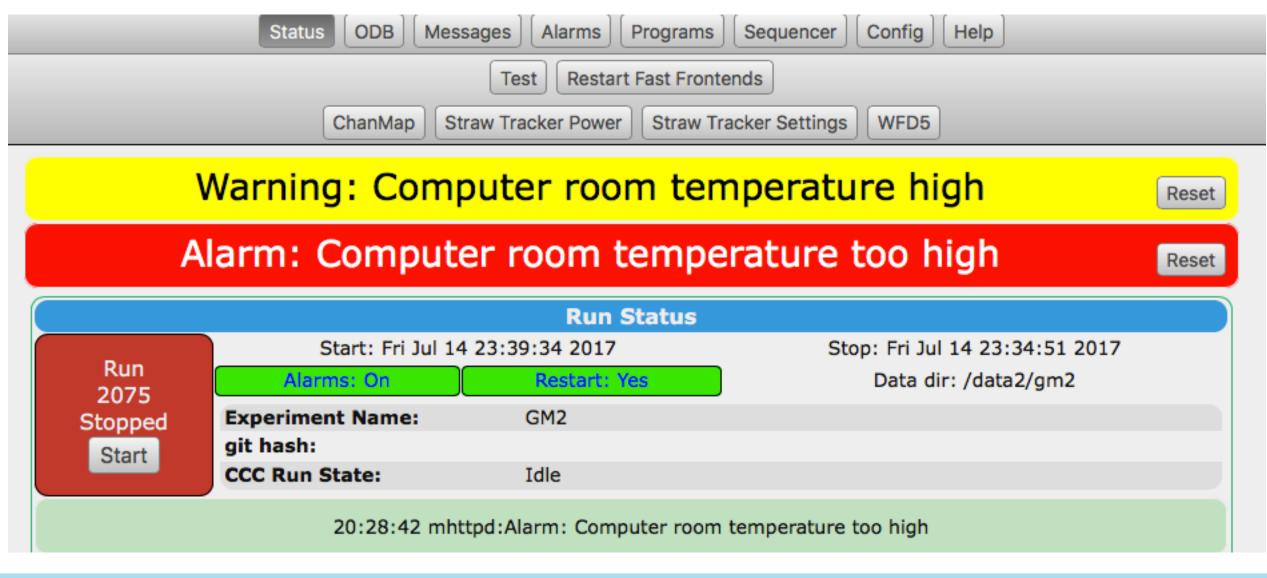




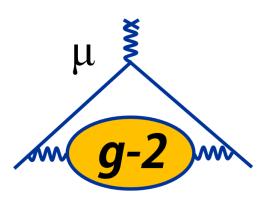


### **MIDAS Alarms**

- The MIDAS alarm system was used as the primary alarm system.
- Alarms were set on temperatures and voltages from MSCB devices.
- Other slow frontends set alarms automatically when encountering an error. Periodic alarm reminded shifters to perform shift checks.
- Had problems at first with alarm audio, which was traced to a recent lack of mp3 support in scientific linux — this was later rectified with a recent update.



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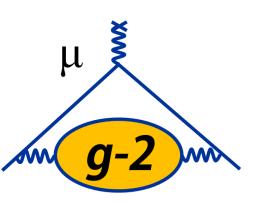


# **Custom Controls Page**

- is very cumbersome.
- masse. Status ODB Messages Chat Al

	Status		Messages		Ala
	АМ	/C130	) • TQ01	. O TQ02	$\bigcirc$
	/E	quipme	nt/AMC1	L300/Se	tti
Channel #	Rider 01	Rider 02	Rider 03	Rider 04	R
00	-200 🗘	-200 💭	-200 🗘	-200 🗘	] [-
01	-200 🗘	-200 🔹	-200	-200	] [-
02	-200	-200	-200	-200	
03	-200 🔪	-200	-200	-200	
04	-200 🗘	-200 🔪	-200 🗘	-200 🖕	] [-
					able
		/Eq	uipmen	t/AMC1	30
Channel #	Rider 01	Rider 02	Rider 03	Rider 0	4 R
00					
01					
02					
0.2			_		

04



#### With this number of frontends, configuring settings via the standard ODB tree

#### A set of custom Javascript pages were written to manipulate ODB values en

arms	) [ P	rogram	s	History	/][	MSCB	) [ s	equence	er	Config		Help			
TQ0	з 🔾	TQ04		Thr	esho	old C	)et x	-segmt		)et y-seg	gmt	]			
ngs	/ТС	Q01/R	lide	erXX/	Ch	anne	IXX	/thre	she	old va	alu	e			
ider	05	Rider	06	Rider	07	Rider	08	Rider	09	Rider	10	Rider	11	Rider	12
200	* *	-200	* *	-200	<b>^</b>	-200	* *	-200	<b>^</b>	-200	*	-200	*	-200	* *
200	<b>^</b>	-200	* *	-200	~	-200	*	-200	<b>^</b>	-200	* *	-200	<b>^</b>	-200	<b>^</b>
200	*	-200	*	-200	~	-200	*	-200	<b>^</b>	-200	*	-200	~	-200	<b>^</b>
200	* *	-200	* *	-200	* *	-200	*	-200	<b>^</b>	-200	*	-200	* *	-200	* *
200	<b>^</b>	-200	* *	-200	^ ~	-200	~	-200	^ ¥	-200	<b>^</b>	-200	*	-200	* *
	Char	n used	Po	ositive c	ross	ing									
0/S	etti	ings/	Rid	erXX	/Cł	nanne	elX	X/ena	abl	ed					
ider	05	Rider	06	Rider	07	Rider	08	Rider	09	Rider	10	Rider	11	Rider	12

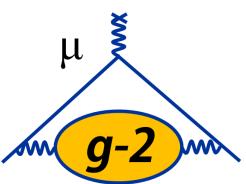


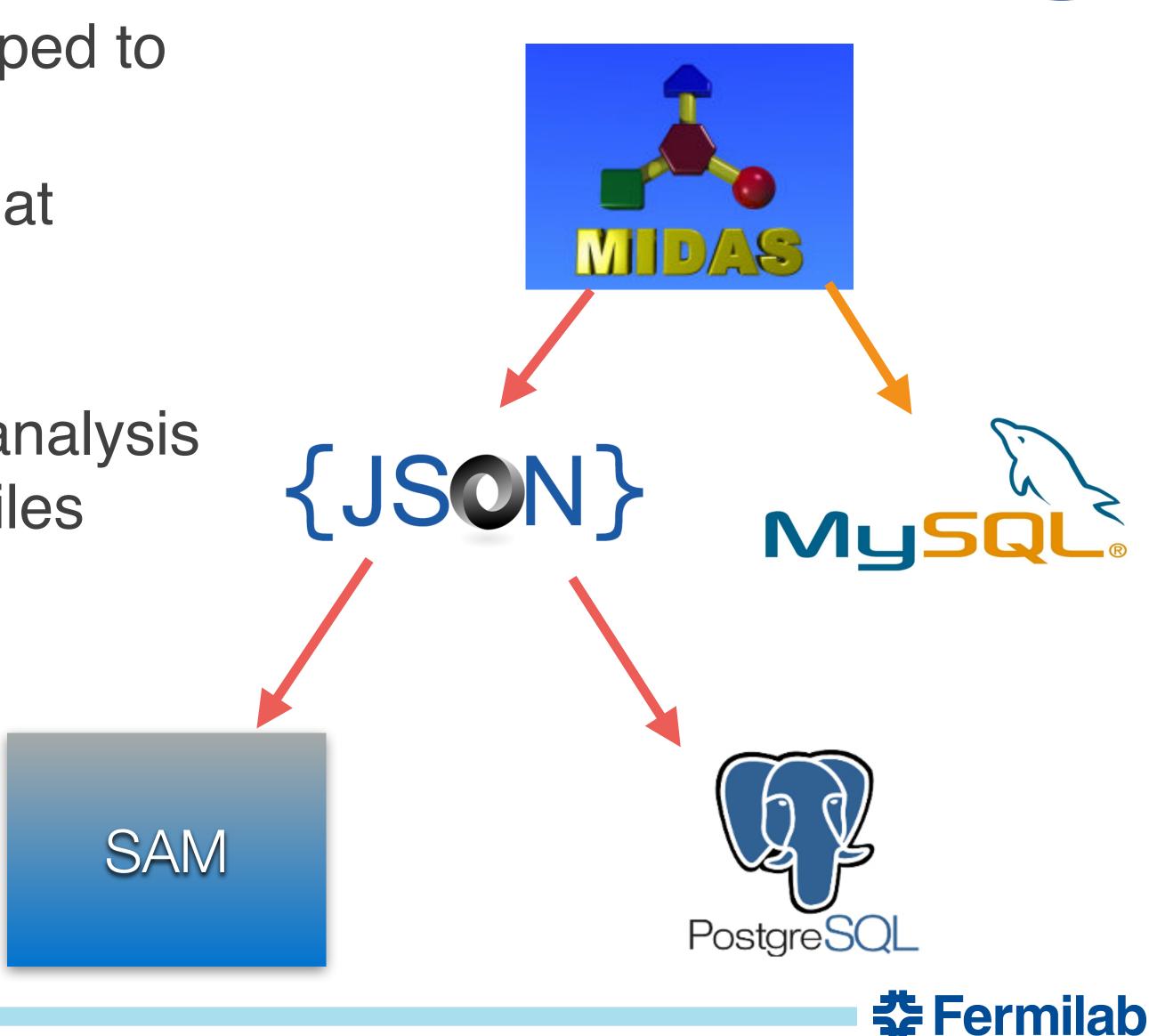




### **MIDAS ODB Archive**

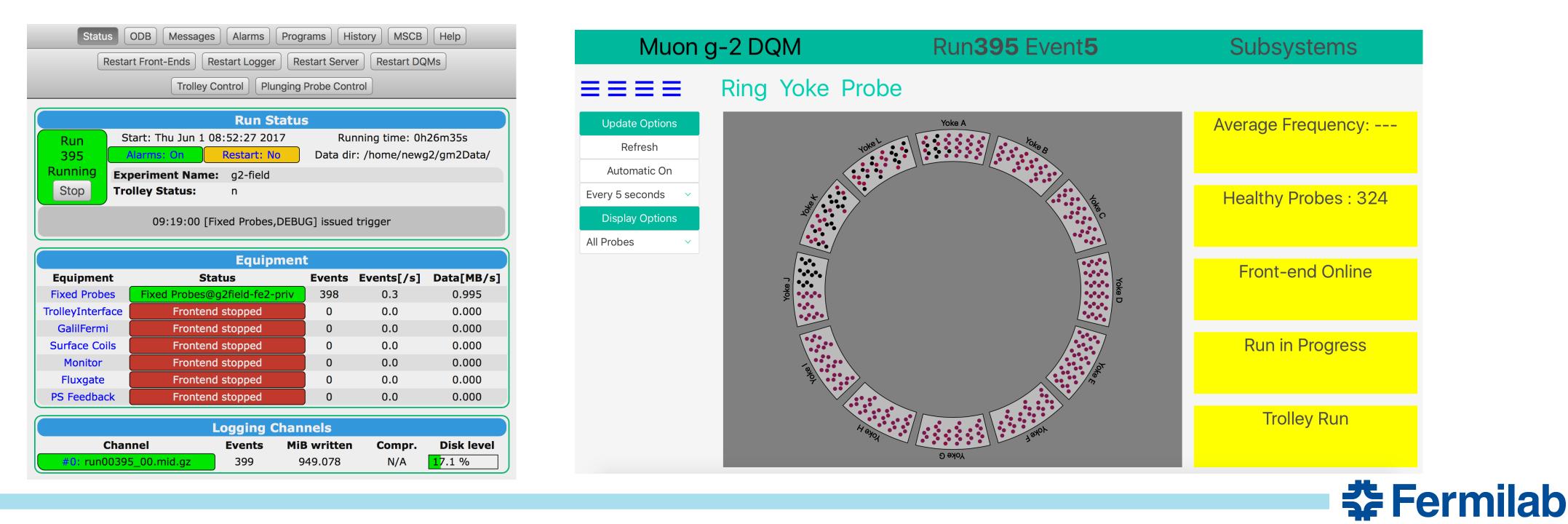
- At each end of run, the ODB is dumped to a JSON file.
- A python routine is then executed that imports the entire JSON file into a PostgreSQL database.
- Metadata that is used in the offline analysis is also extracted from these JSON files using python plugins.



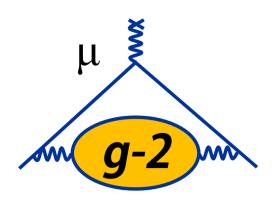


# **Field DAQ**

- Field DAQ runs in independent MIDAS experiment.
- Contains seven asynchronous frontends reading data from fixed magnetic field probes and from a trolley that periodically transverses the ring to perform precision measurements of magnetic field.
- Data is correlated with the fast DAQ offline using GPS timestamps.



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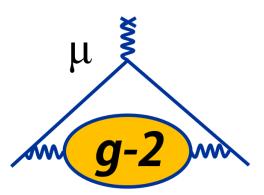


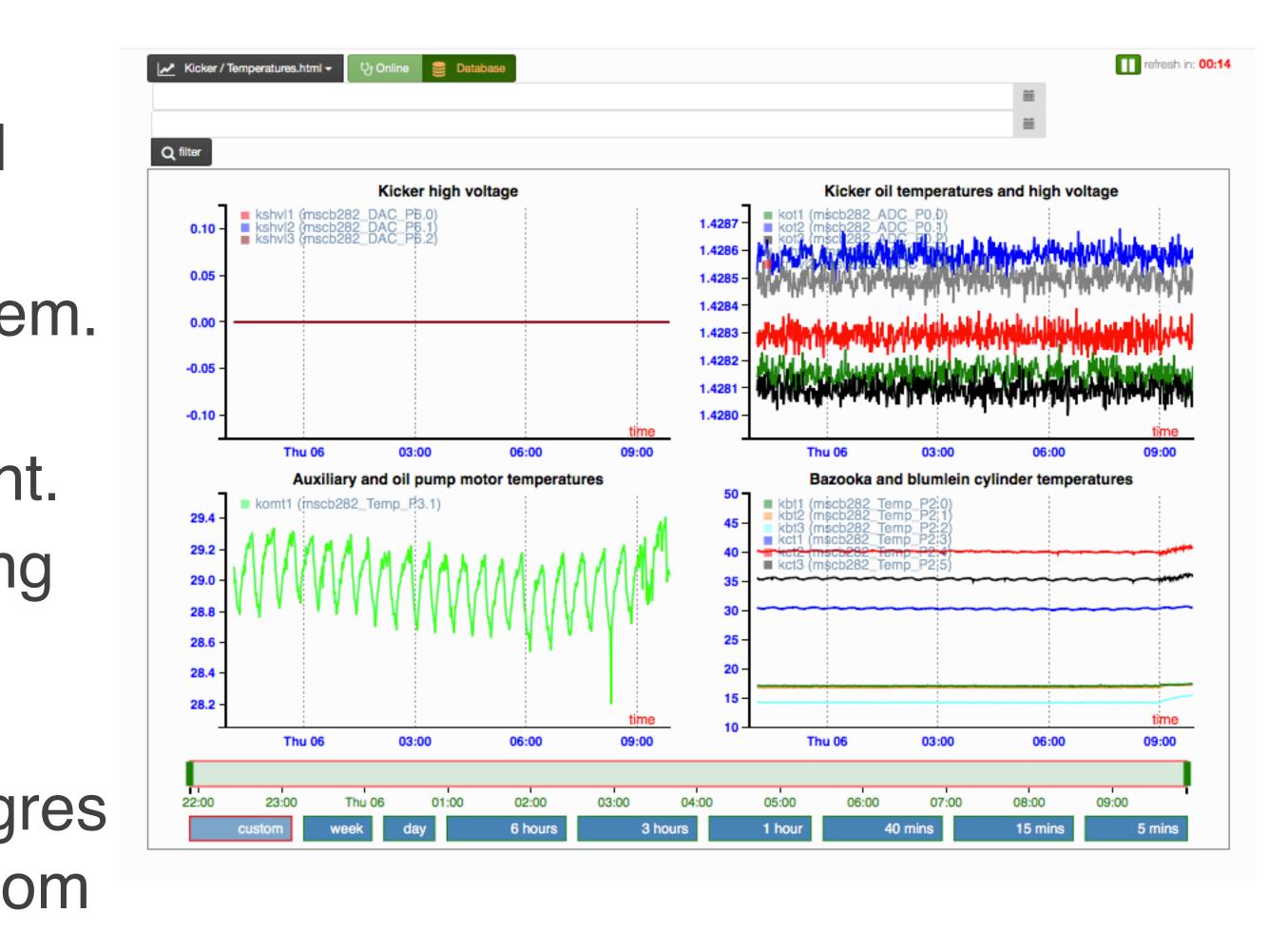


# **Slow Controls**



- DAQ includes six SCS3000 mscb devices.
- 24 beaglebones reading slow control data from calorimeters.
- HV and LV frontends for tracker system.
- Slow frontend reading magnet properties from IFIX via an OPC client.
- Beamline frontend periodically reading output of beam components from database.
- Slow control data is stored in a Postgres database and displayed using a custom Django web display.

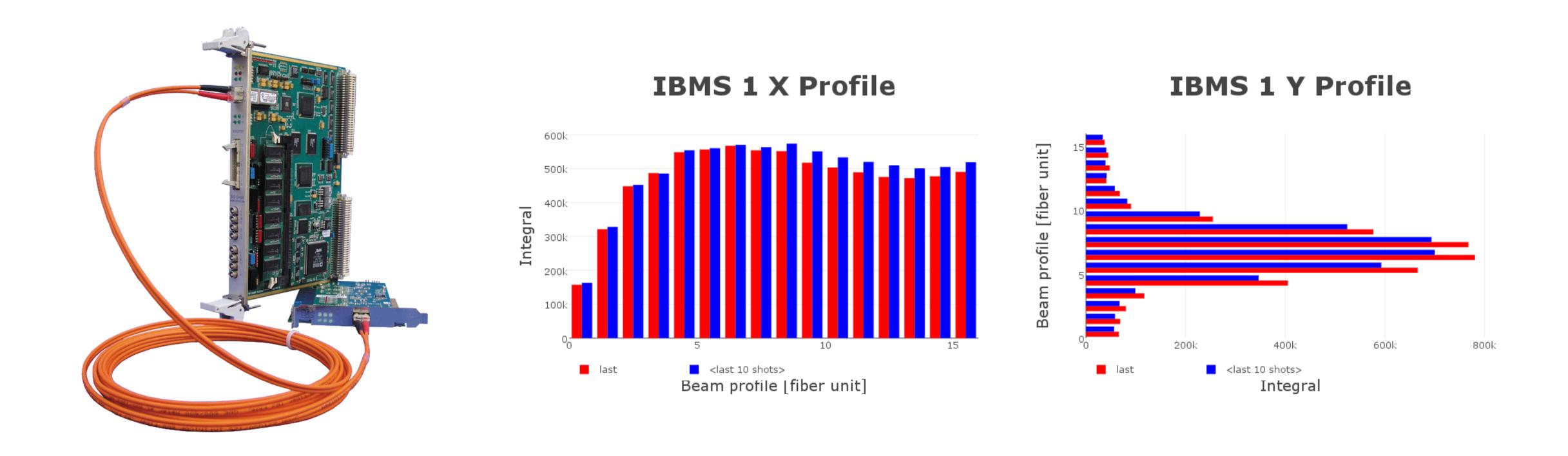




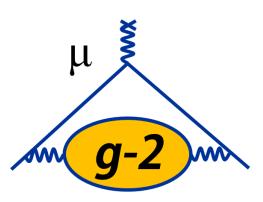


# **IBMS Frontend**

- Data from the inflector beam monitoring system (IBMS) is read out via a CAEN digitizer.



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#### A custom MIDAS frontend was written to integrate this detector into the DAQ.



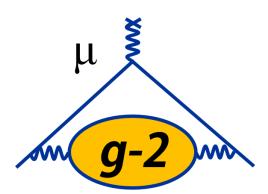


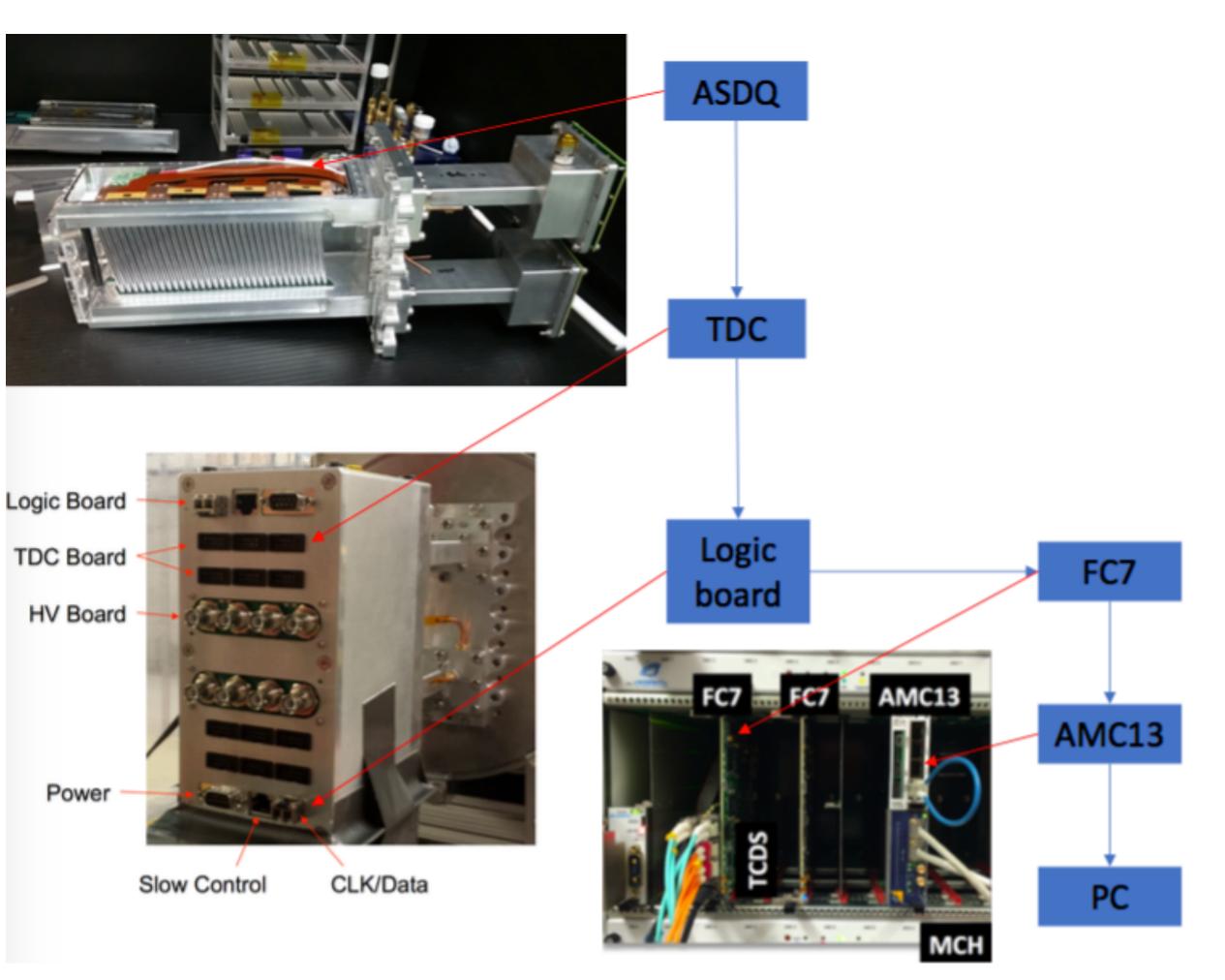


#### **Tracker Frontend**

- Three tracker stations will be read via one uTCA crate.
- Reads data from AMC13.
- Instead of digitizers, data comes from multihit TDCs that are read via FC7 cards.

3/21/19 72 W. Gohn (Siemens Healthineers) | GPUs for DAQ and Simulation in Muon g-2





(Thanks R. Chislett for the diagram)



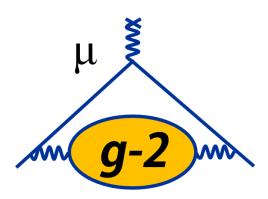


### **Event builder**

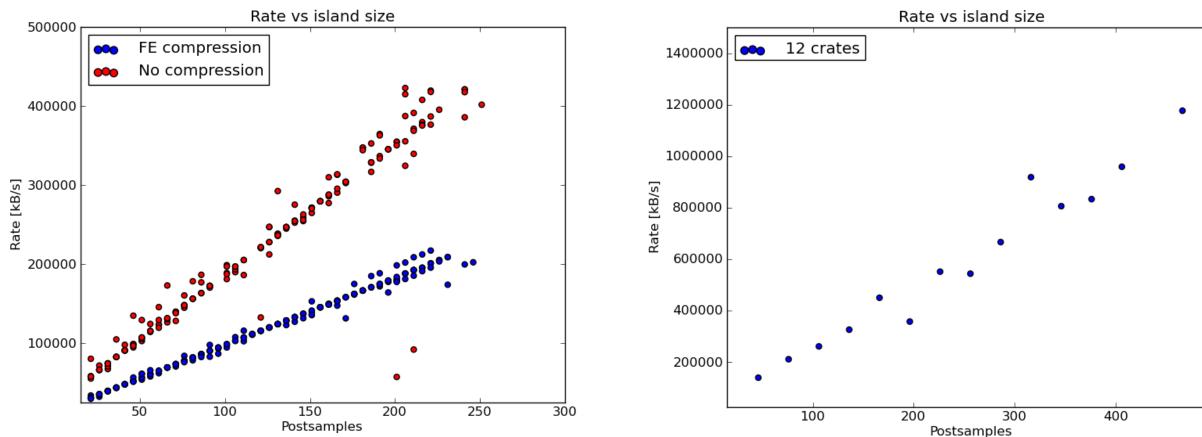
ODB Equipment of each frontend.

Online Database Browser			
Find Create Delete Crea	ate Elog from this	page	
/ Equipment / AMC1308 / S	Settings / Glo	bals /	Enable here!
Key	Value	+	
sync	n		
use AMC13 simulator	n		
GPU Device ID	2 (0x		
Send to Event Builder	y Carl		
Shelf configuration	rider		
FE lossless compression	n		
raw data store	У		
raw data prescale	1000 (0x3	E8)	
raw data prescale offset	8 (0x8)		

- Total EB rate maxed out at > 1.2 GB/s (limited by network bandwidth)
- The event builder combines up to 270 banks for each event.



#### Modified event builder to change how it is enabled — now done entirely in



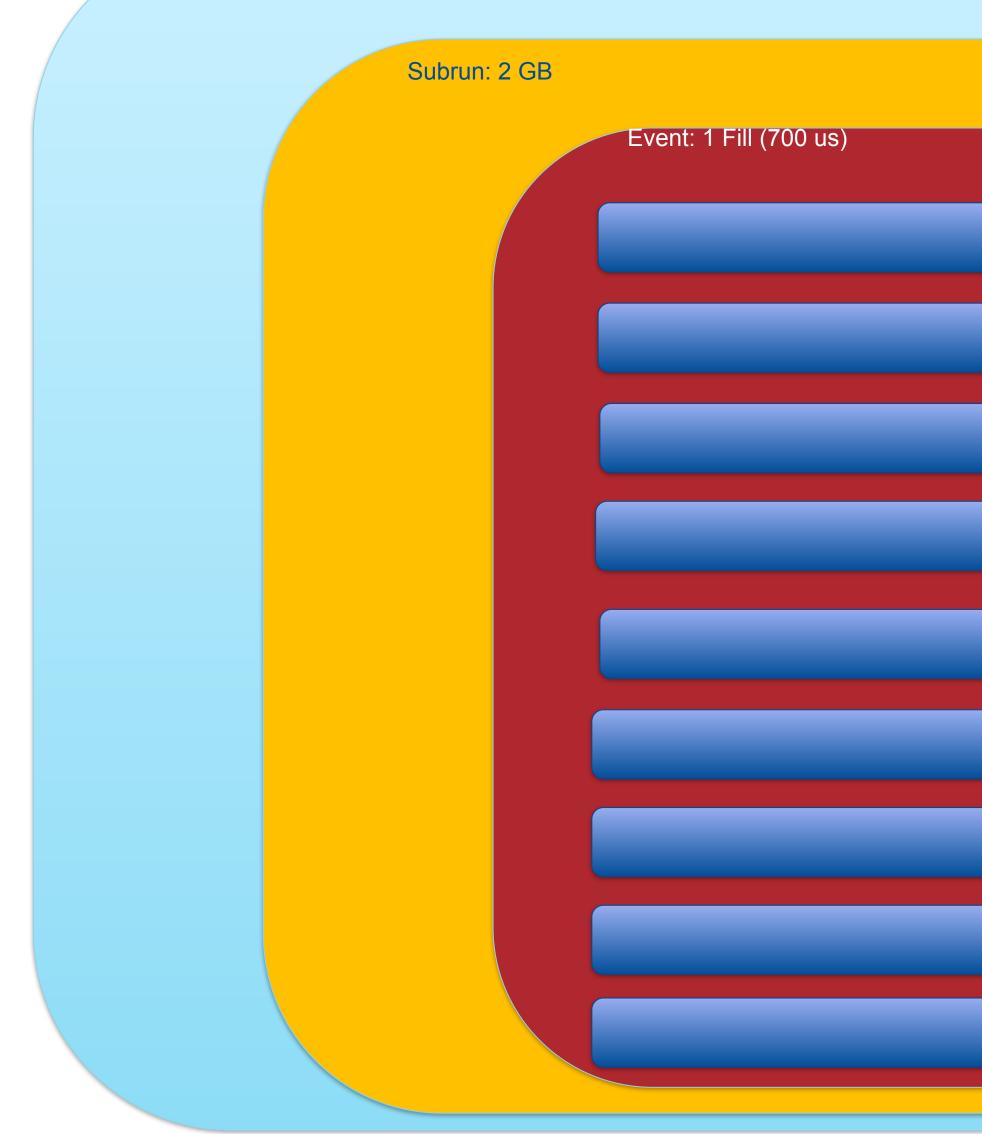






#### **Data Format**

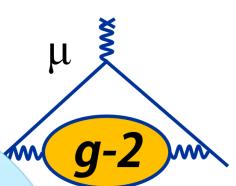
MIDAS Run: 1 Hour, 120 subruns



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	9
GPS Timestamp	
T-method	
Q-method	
Prescaled Raw	
Pedestals	
Header/Trailer	
Process monitoring	
Auxiliary banks	
Tracker bank	
	Jt Earm





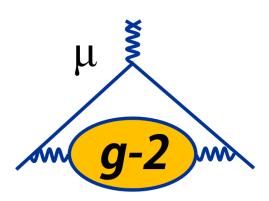
# **DAQ Performance During First Run**

- The MIDAS DAQ performed well during our first run.
- Day shifts were mostly dedicated to beam line commissioning, so

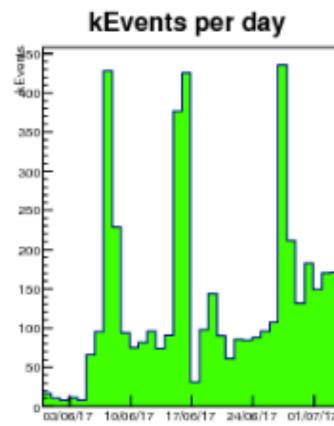


3/21/19 W. Gohn (Siemens Healthineers) I GPUs for DAQ and Simulation in Muon g-2

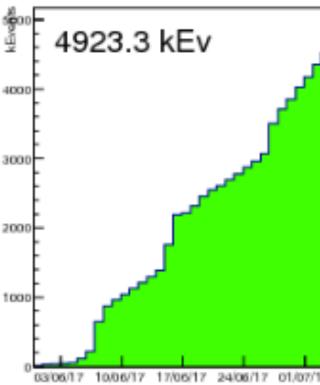
75



Muon G-2 data taking



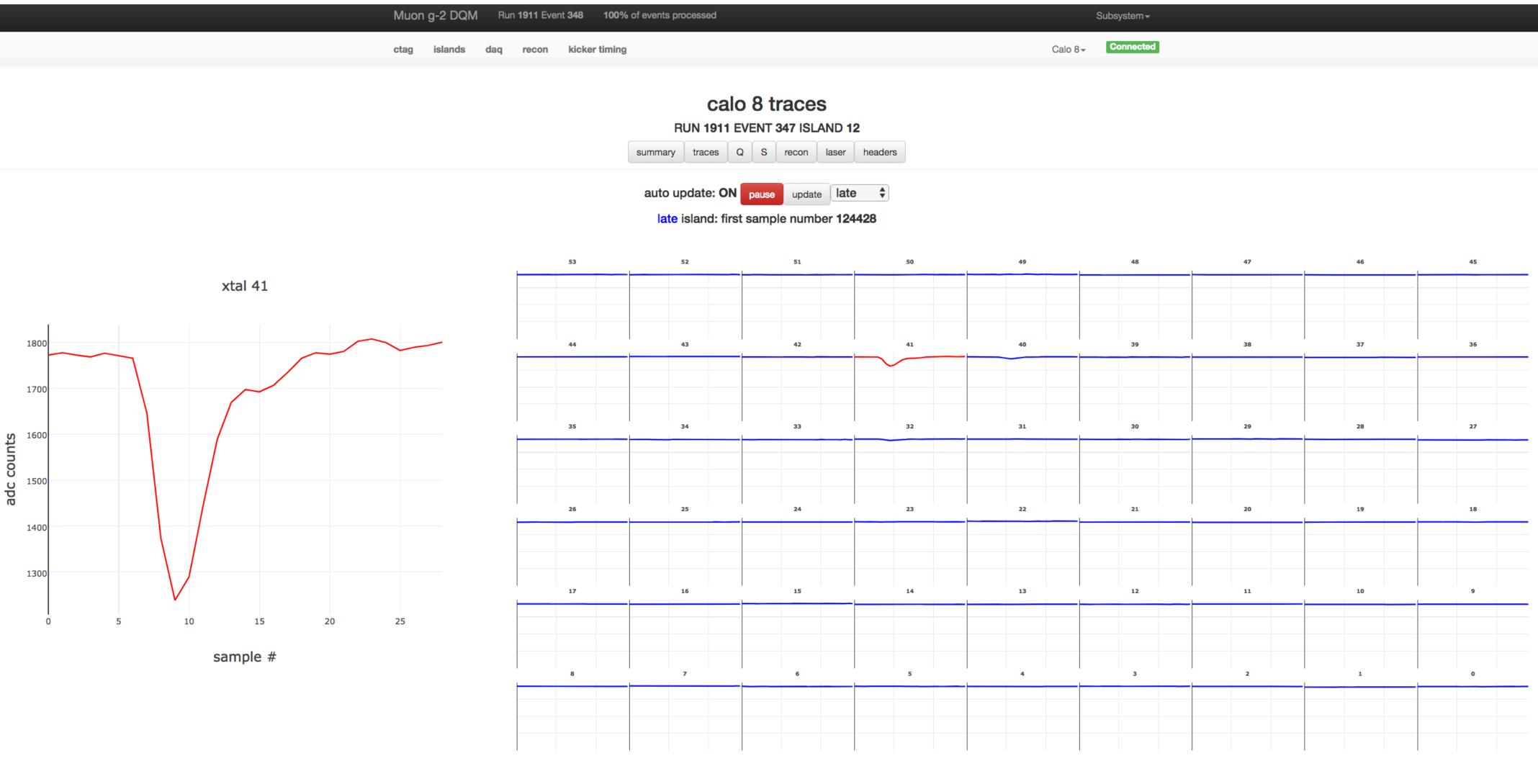
Collected kEvents



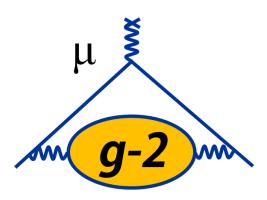




## **Position of pulse in calorimeter**



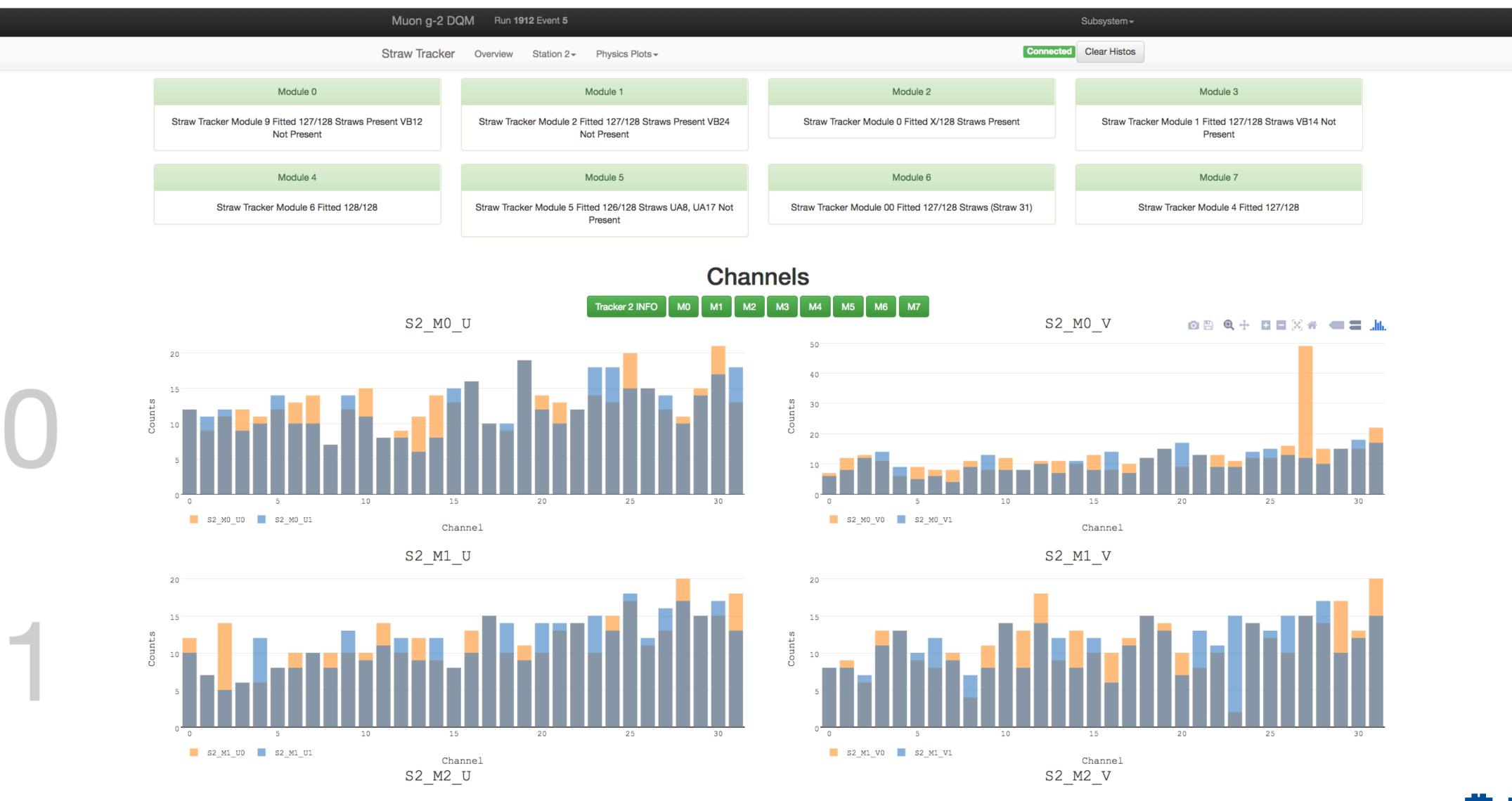
76 8/2/17 W. Gohn I U. of Kentucky I DAQ for Muon g-2







#### **Tracker Monitor**



W. Gohn I U. of Kentucky I DAQ for Muon g-2 8/2/17 77



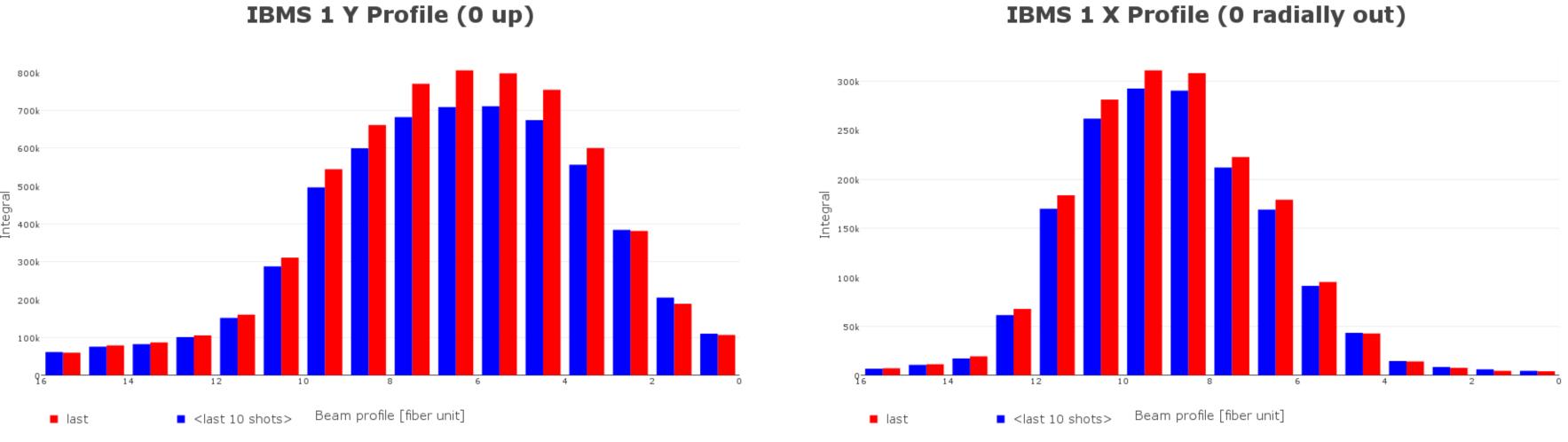


μ

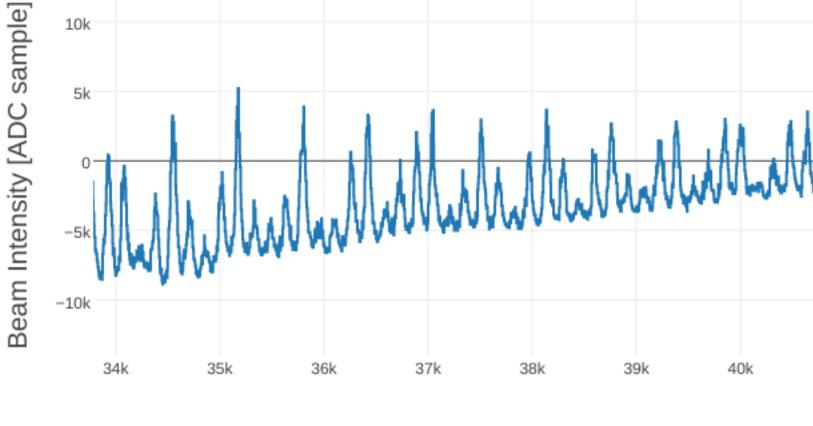


#### 0





IBMS 1 Y Profile (0 up)



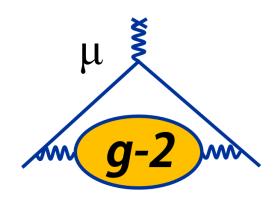
270 deg Y-profile Harp

# **IBMS and Fiber Harps**

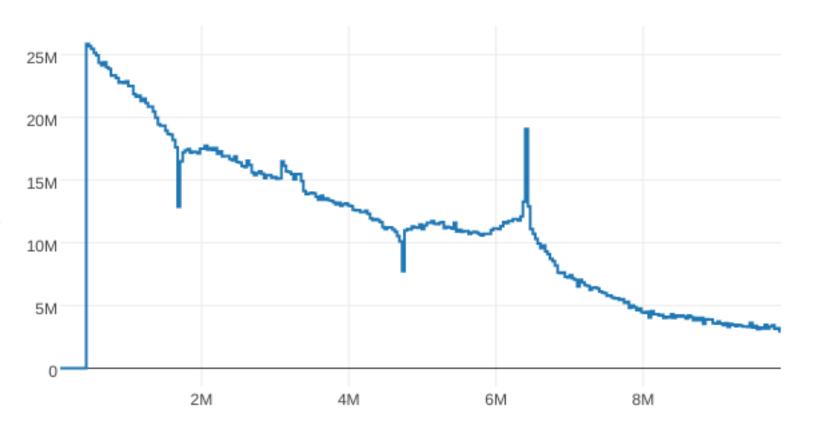
10k

8/2/17 W. Gohn I U. of Kentucky I DAQ for Muon g-2 78

Amplitude



#### FFT BEAM INTENSITY (Y-profile Harp at 180 deg)

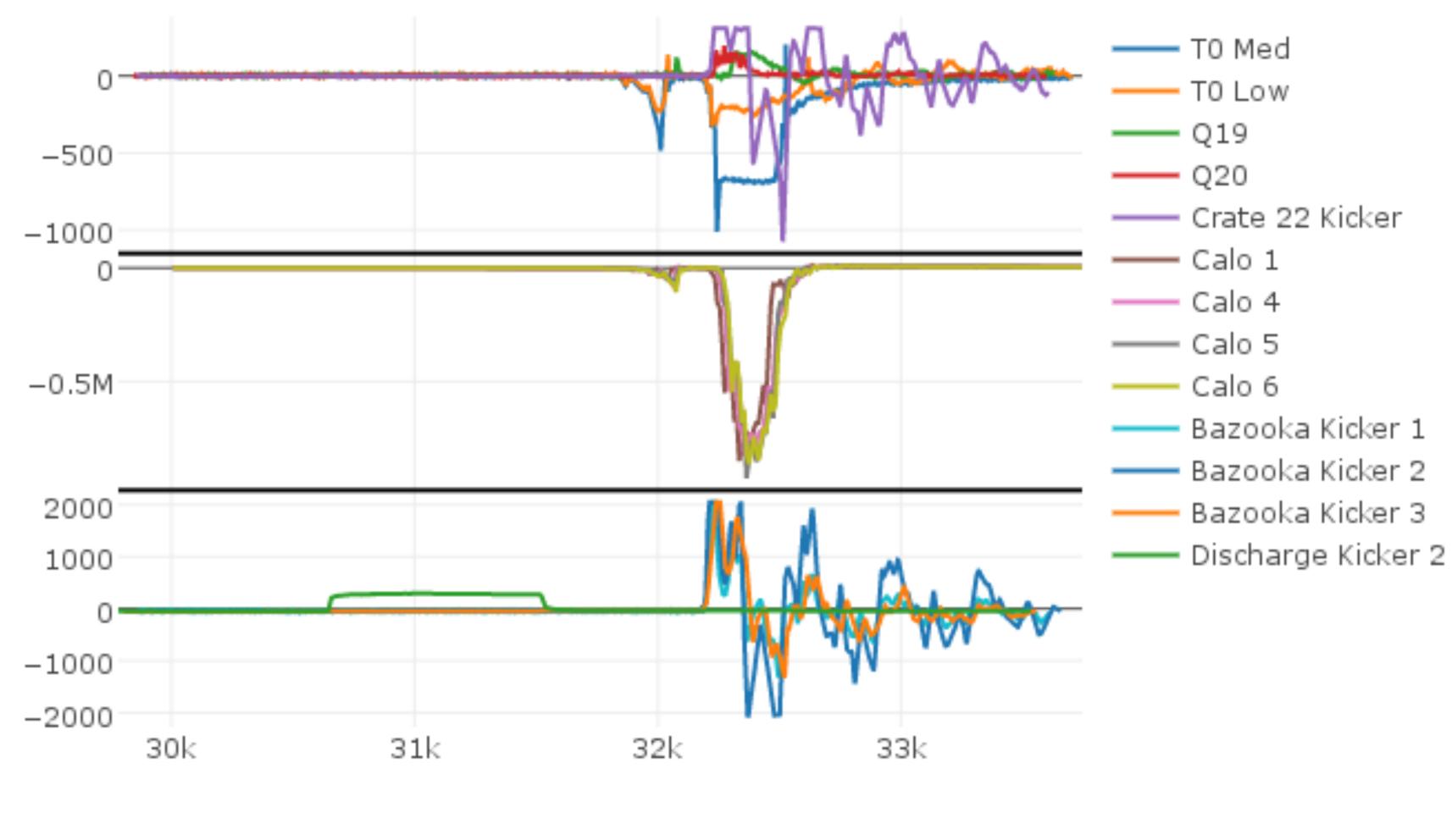


Frequency [Hz]





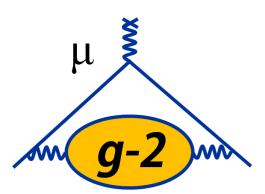
### **Monitoring Beam Injection**



#### time [ns]



W. Gohn I U. of Kentucky I DAQ for Muon g-2





### **Nearline analysis**

• Two dedicated machines in the control room are used for near line analysis.

z

10<sup>3</sup>

10<sup>2</sup>

calo2:1

calo9;1 calo11;

calo14; calo15;

calo16; calo17; calo18; calo19:

calo23; calo24;

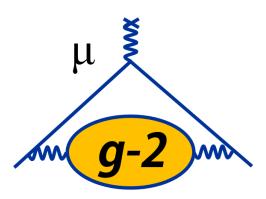
allCaloEnerg allCaloWiggle

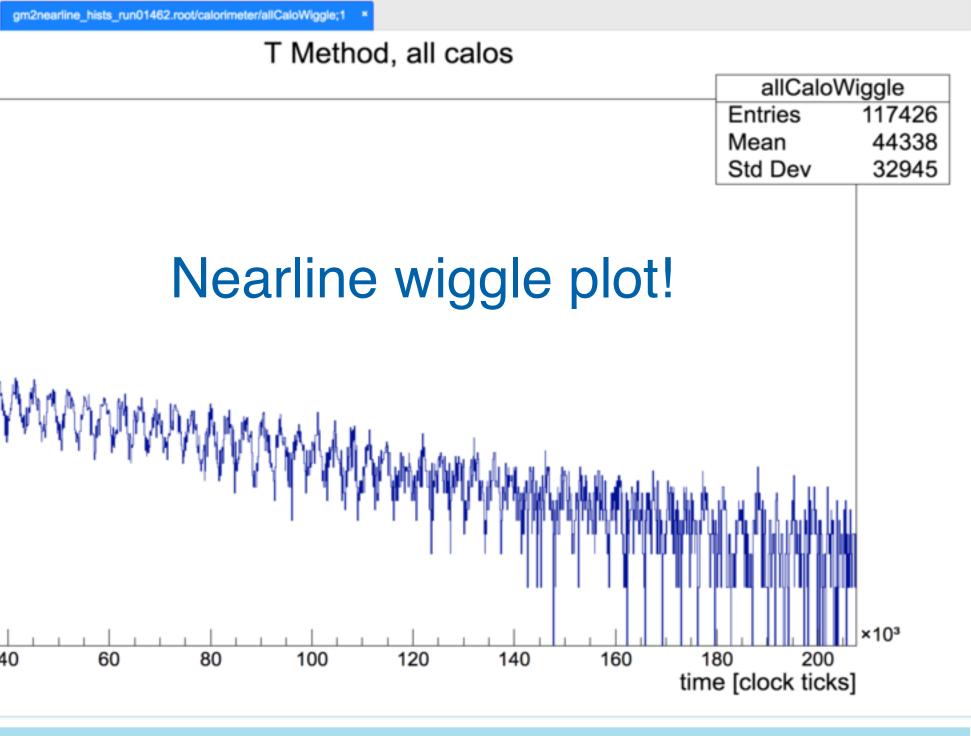
earlineCTag

- The near line analysis processes data from the most recent run, but performs the full artbased analysis on every run it processes.
- It is allowed to get behind the current run, but so far it can keep up with the live running. • A set of histograms is made available for each processed run via the Django based web
- display utilizing JSRoot. calorimeter/allCaloEnergies

Select run, detector, and plot from menu

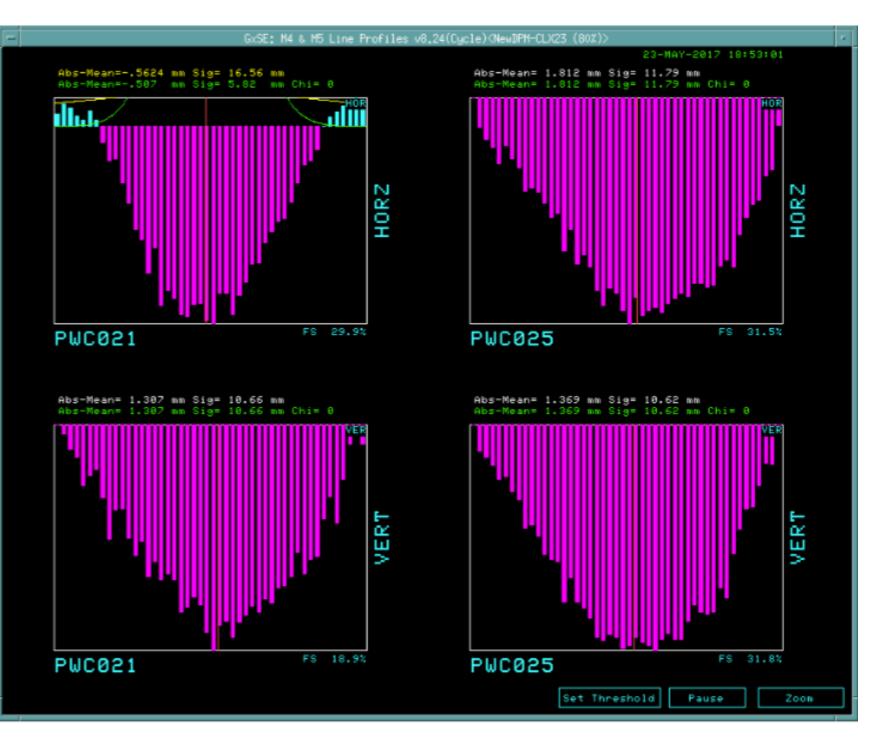
Plots combining data from multiple detectors.





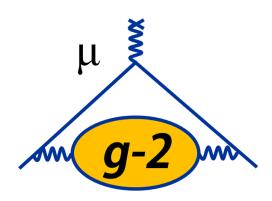


## **Beam monitoring**



- ACNET
  - A dedicated ACNET terminal is in the control room as is used by shifters to observe the status of beam line components.
- IFBeam
  - An IFBeam display is kept visible for the shifter on one of the control room monitors to view trend plots of beam line measurements such as protons on target.
- MIDAS Beam frontend
  - A dedicated MIDAS frontend reads data from the IFBeam service and writes it in the data stream.

components.

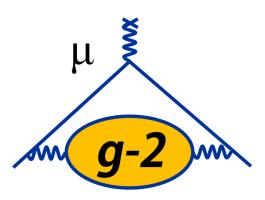


To-do before next run: Update MIDAS frontend to account for relative timing between beam line



### Hardware redundancy plan

- Working with SLAM to develop a detailed plan for the replacement of any machine in the DAQ system.
  - Hot spare for GPU-based frontend machine for calorimeter readout (hot spare was successfully used during commissioning!)
  - Redundant backend systems that could share load temporarily if necessary.
  - Plan to add second database server.
  - IBMS requires custom hardware only one machine now that can handle it.
- All computers are under warranty.
- Agreement negotiated with Dell on-site support to provide routine maintenance for hardware issues to reduce the likelihood of sending a machine off-site for repair.



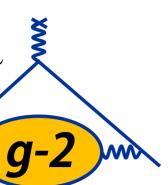




## **Contributing Institutions and Responsibilities**

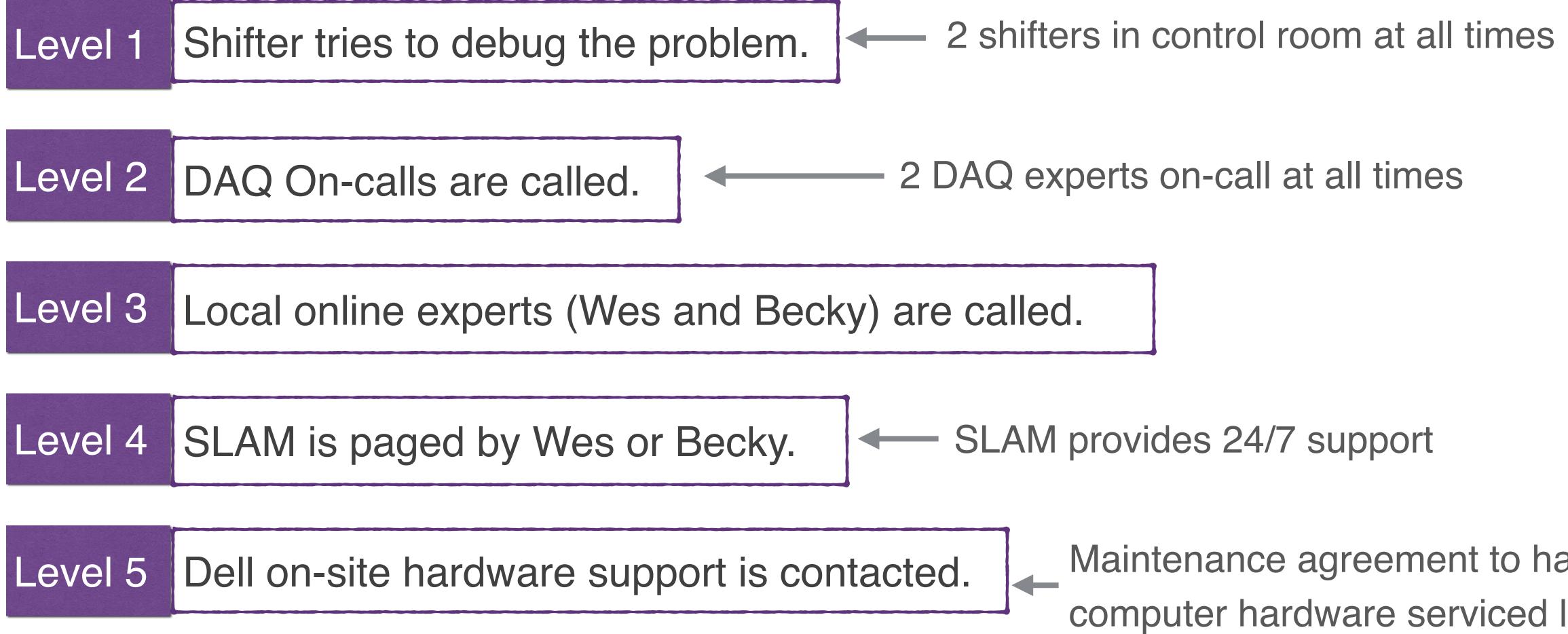
			, sm ( <b>C</b>
Institution	Responsibilities	Personnel	
University of Kentucky	AMC13 Readout, GPS, DAQ Hardware, IFIX integration, Online Systems Management	PI + PD (on site) + GS (on site)	
University College London	Tracker readout, Online Management	PI (on site) + PD (on site) + GS (on site)	
University of Washington	DQM, IBMS readout, Field, Nearline	GS + 2x GS + PD	
Northern Illinois University	Slow controls	PI	
Argonne National Lab	Field DAQ	PD (on site)	
JINR, Dubna	Web interface, Event display	2x Scientist	
Novosibirsk	Django Web Display	PD	
University of Michigan	Field	GS	
Shanghai	Database management	PD	~24 total
Italy (Frascati + Napoli)	Laser system integration	PI + <mark>PD (on site)</mark> + PD + GS	RED = DAC
Cornell	Auxiliary detector integration, Clock	PD + GS (on site)	
Fermilab	Beamline integration	Scientist	



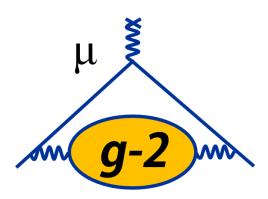




# **DAQ On-site support**



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Maintenance agreement to have computer hardware serviced locally.



