











#### WP 5: R&D Belle II PXD DAQ

Jens Sören Lange (Justus-Liebig-Universität Giessen) Jennifer 2 General Meeting, *Prague, 18.11.2022* 

#### WP 5.2

### b) Online data acquisition and remote controls

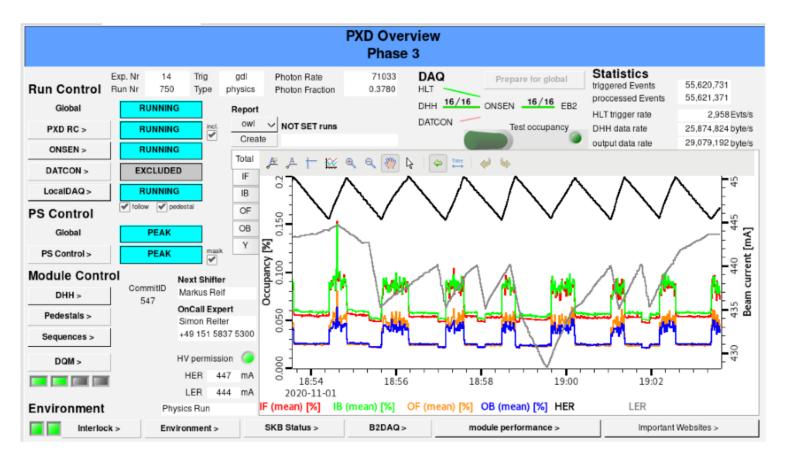
- new hardware technologies for high bandwidth data transfer
  - optical technologies (16.3 Gbps)
  - 10 Gbps ethernet
- precise timing distribution in sub-nanosecond regime
- intelligent realtime algorithms for online data reduction
  - Belle II background rejection on FPGAs
  - HyperK vertexing on trigger level (t <10 ns) on GPUs</li>
- novel programming and DAQ software techniques
  - parallelisation on both FPGAs or GPUs
  - methods of artificial intelligence for trigger decisions
  - integrated dynamic service discovery, monitoring, fault tolerance, dynamic routing and remote control.

### Outline

- What has changed in the past 3 years?
- Results on high bandwidth data transfer (Belle II PXD)
- Results on "AI" algorithms and hardware implementation (Belle II PXD)

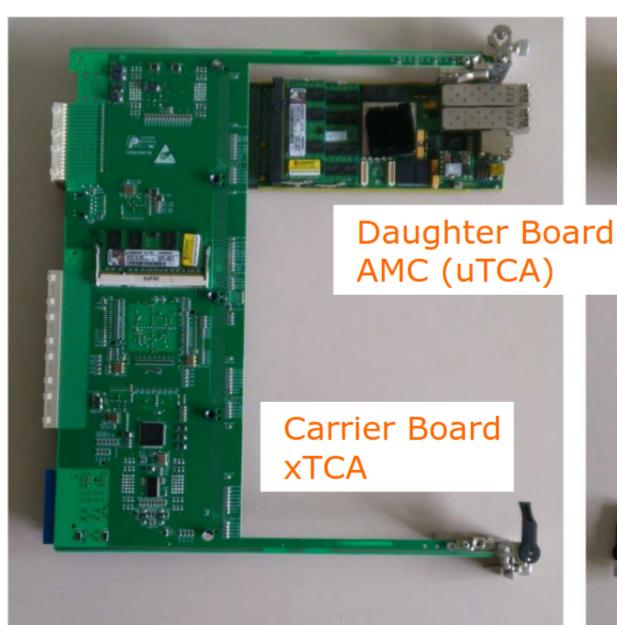
### What has changed in the past 3 years?

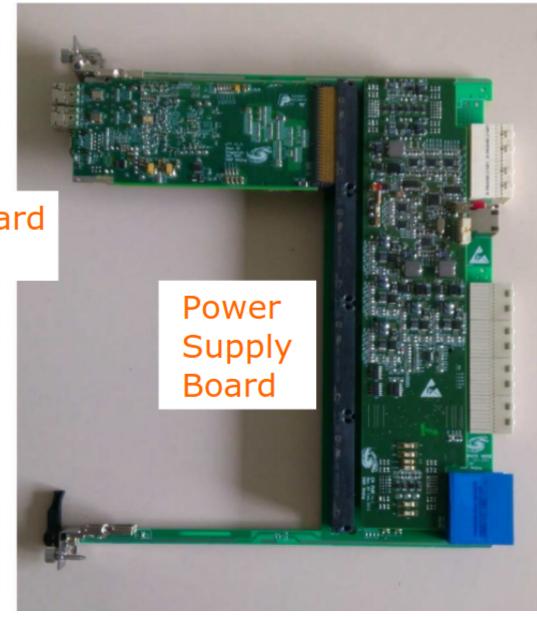
- Belle II recorded 428 fb $^{-1}$  recorded (comparable to complete BaBar data set)
- PXD DAQ stable, uptime 98.8% (relativ to Belle II DAQ)
- physics results with PXD: lifetime of D<sup>0</sup>, D<sup>+</sup>,  $\Lambda_c^+$ ,  $\Omega_c^0$  measured precisely
- PXD decommissioned, work focused on PXD2 installation (long shutdown)



Occupancy
calculated
online on
PXD DAQ
(Onsen system)

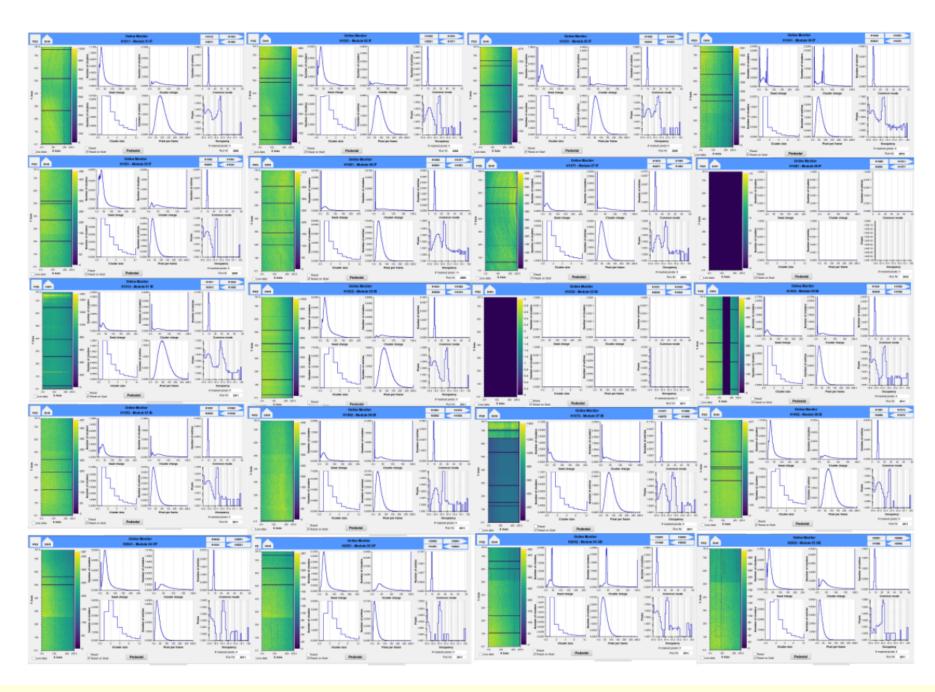
# PXD DAQ, ONSEN system hardware







### PXD online monitor during Belle II physics data taking



# HIGH BANDWIDTH DATA TRANSFER

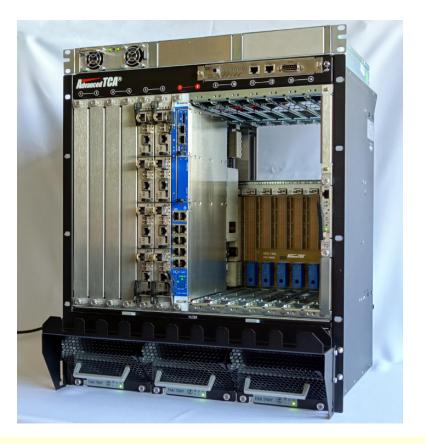
# Link bandwidth compared

Wifi (802.11 a/g)	20 Mbps	
4G	20 Mbps (download)	mobile phones
5G	100-300 Mbps (download)	mobile phones
Gigabit Ethernet	1 Gbps	cable (electrical or optical)
ONSEN link	6.125 Gbps	optical
ONSEN link new carrier board	16.3 Gbps	optical
complete PXD	~200 Gbps @ 3% occupancy (5 DVD per 1 second)	
ATCA ADLINK aTCA-3150	10 Gbps (uplink)	
ATCA ADLINK aTCA-3710	40 Gbps (uplink)	



### Test of ATCA switch with 10G uplink

- Output from PXD system to event builder
- Is it possible to reduce 32 cables with 1G
   by 1 cable with 10G?
- Does the switch break down?
- Is the buffer large enough?



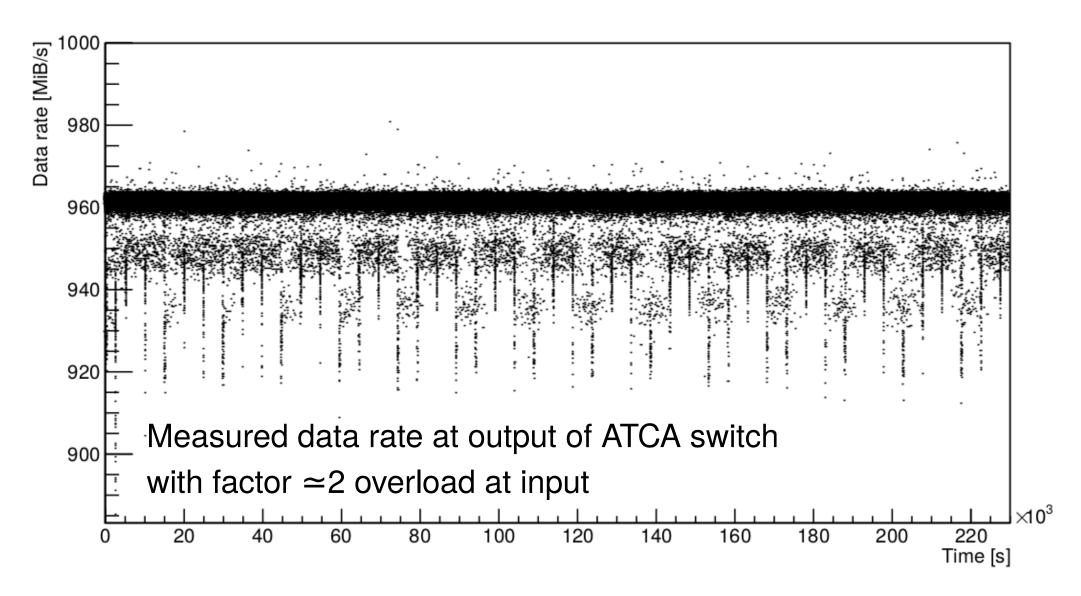


ATCA ADLINK aTCA-3150 10G Uplink

ATCA ADLINK aTCA-3710 40G Uplink



### Test result of ATCA switch with 10G uplink



Klemens Lautenbach, Ph. D. thesis, [link]

### New ONSEN hardware

- New generation of ONSEN ATCA carrier board
- past: Xilinx Virtex-5 FX 70T
   future: Xilinx Kintex Ultrascale 060
  - factor 10 more FPGA resources
  - factor ~2.5 higher link bandwidth (16.3 Gbps)
- New firmware developed (master thesis Matthäus Krein): link layer protocol changed from Aurora to AXI Stream

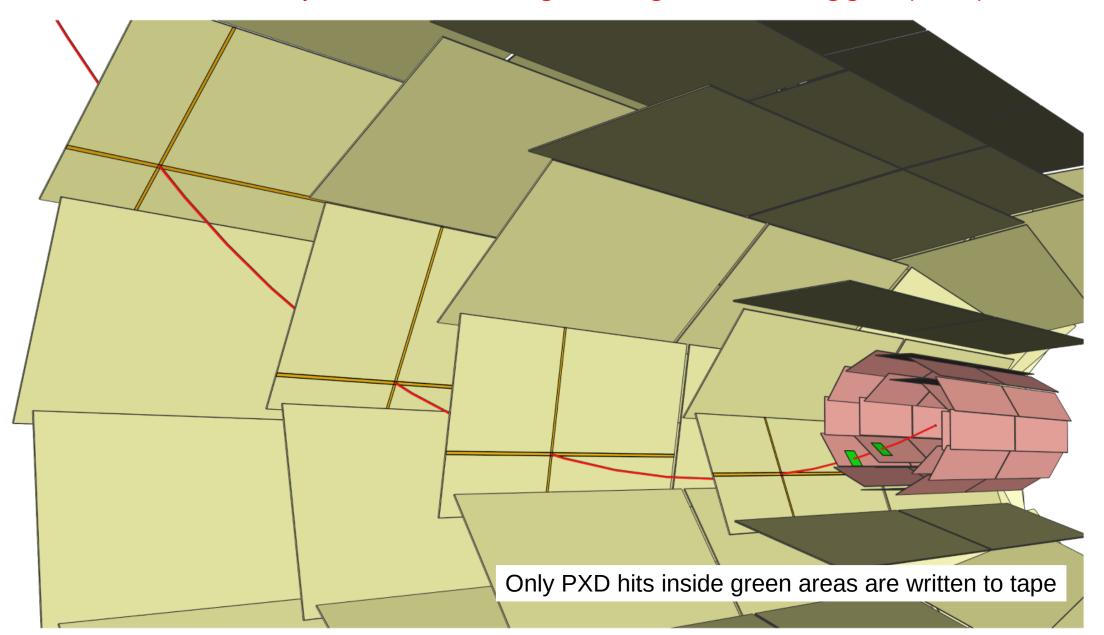


# **AI\* METHODS**

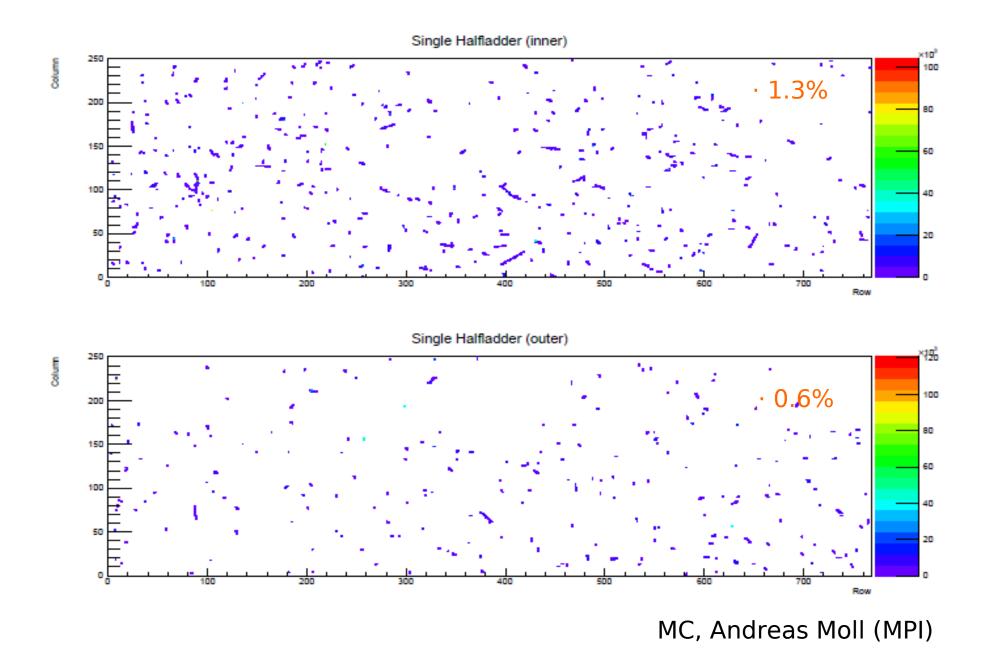
\*better terminology:
ML METHODS
(machine learning)

we use Neural Networks (NN)

# Region-of-Interest (ROI) Selection based upon track finding on High Level Trigger (HLT)



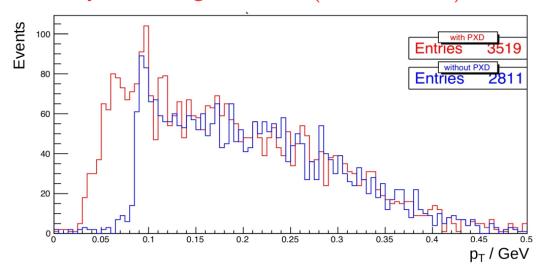
#### **PXD** clusters



### **Ansatz**

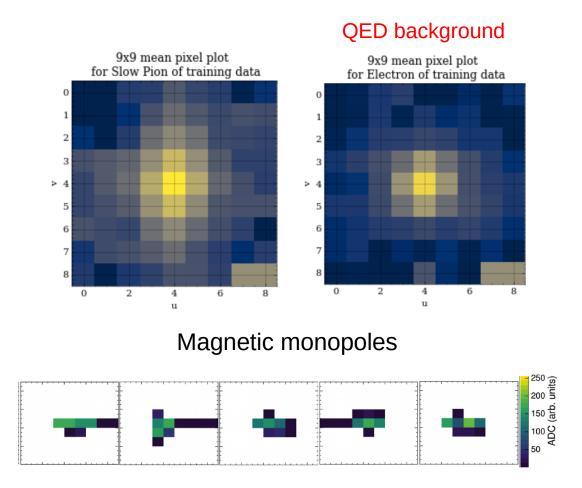
- Problem:
  - slow pions have high dE/dx and don't reach outer detectors (SVD, CDC)
  - no HLT track
  - no region-of-interest (ROI) in ONSEN system
  - PXD hits are deleted online (before data reach the tape)
- Giessen ML approach:
  - "cluster rescue"
  - image processing
  - $9\times9$  pixel images and global (x,y,z) position are input to Neural network (NN), ADC value is greyscale
- Ansatz applies to all highly ionizing particles:
   slow pions, antideuterons, magnetic monopoles, ...

Example: slow  $\pi^-$  from  $D^{*-}$  in decay of a charged Z state (exotic hadron)



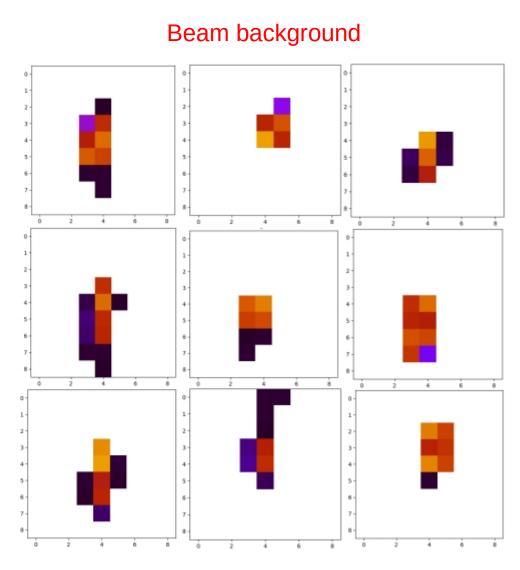
### 9x9 pixel matrix

Center of the matrix is the seed pixel (= pixel with max. charge)



Reminder: Jennifer WP5, "background rejection"

- Beam background
- QED background (electrons)

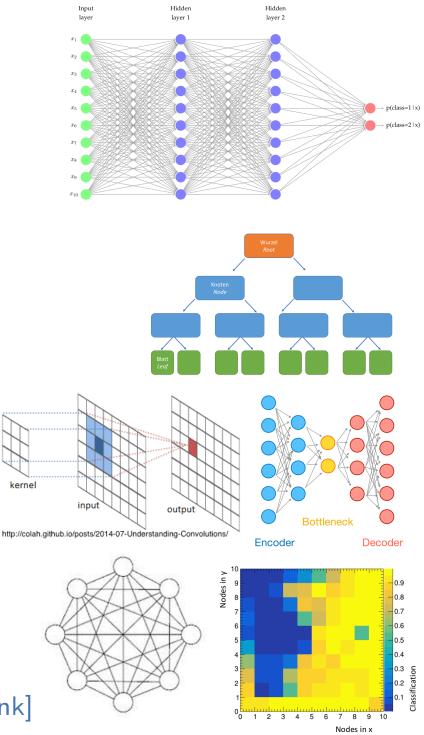


## NN projects, algorithms

Multilayer perceptron	Katharina Dort	
Self-Organizing Map	Katharina Dort, Stephanie Käs	
Hopfield NN	Irina Heinz	
n-dim voxels	Johannes Bilk, Johannes Budak	
Decision trees	Stephanie Käs	
Convolutional NN	Johannes Bilk	
Support Vector Machines	Timo Schellhaas	
Autoencoder	Katharina Dort	
Statistical methods (PCA, LDA)	Stephanie Käs	
Graph NN	Martin Beyer	

- Results: slow pions can be classified with efficiency ≥80% and purity ≥80% (only based upon images of PXD clusters, no particle tracks!)
- Results published for magnetic monopoles
   Anomaly detection

K. Dort et al., Eur. Phys. J. C 82 (2022) 7, 587, [link]



### NN projects, hardware implementation

- Tests at Giessen
  - GPU (Marvin Peter, Kim Giebenhain), nVidia QUADRO GPU
  - FINN Framework (Peter Lehnhardt), Xilinx Zync FPGA
  - DSP slices on FPGA (Falk Zorn), Xilinx Virtex FPGA (test of 4x4 matrix multiplication)
- Side remark: Belle II has a Neurotrigger in operation (KIT, TUM, BMBF project)





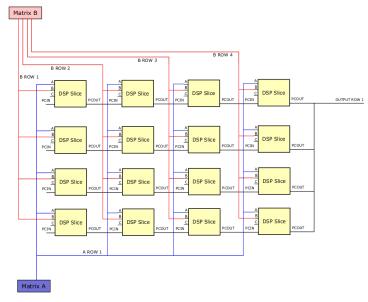


Figure 3: Schematic for DSP slice arrangement for the first calculation step.

### Plan

- upcoming 5 secondments for Giessen available
- Planning for 2023 started, 1<sup>st</sup> secondment in February
- Tasks will be defined, some preparation required.

Task	Secondment sub-task	Remark
high bandwidth data transfer	new carrier board	requires extra hardware at KEK
"AI"	focus on beam background rejection	
sub-nanosecond timing	(not needed for PXD)	not discussed today
parallelisation	TODO	not discussed today

- reminder: PXD is decommissioned, work will focus on PXD2 installation
- some synergy with EURIZON project (next generation e+e- colliders):

Jennifer2: DAQ with large events (0.5 MB), high bandwidth

EURIZON: DAQ with small events, but very high trigger rates (400 kHz)

### Conclusion

- New situation: several subtasks related to WP 5.2 have been worked on in the past 3 years, funded by other sources.
- Future focus will be on PXD2
- Secondments can start in spring 2023, sub-tasks to be adapted
- Reminder: WP has only one deliverable
   D5.2 (was due by month 36 in past timetable)
   "REAL TIME WORKSHOP"
   jointly on Belle II (PXD) and Hyper-K DAQ technologies

# **BACKUP**