



Development of an Electric System for pnCCD onboard HiZ-GUNDAM with Integrated Charged-Particle Event Removal Algorithms

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Tatsuya Sawano^A, Takanori Sakamoto^C, Hiroshi Tomida^E,
Akihiro Doi^E, Robert Hartmann^F, Lothar Strüder^F

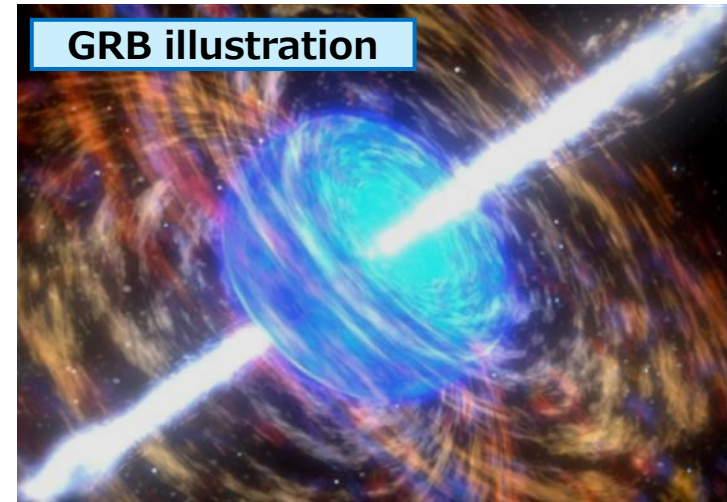
^AKanazawa University, ^BRIKEN, ^CAoyama Gakuin University,
^DKwansei Gakuin University, ^EJapan Aerospace Exploration Agency,
^FPNSensor GmbH

Gamma-Ray Burst (GRB)

Gamma-Ray Burst

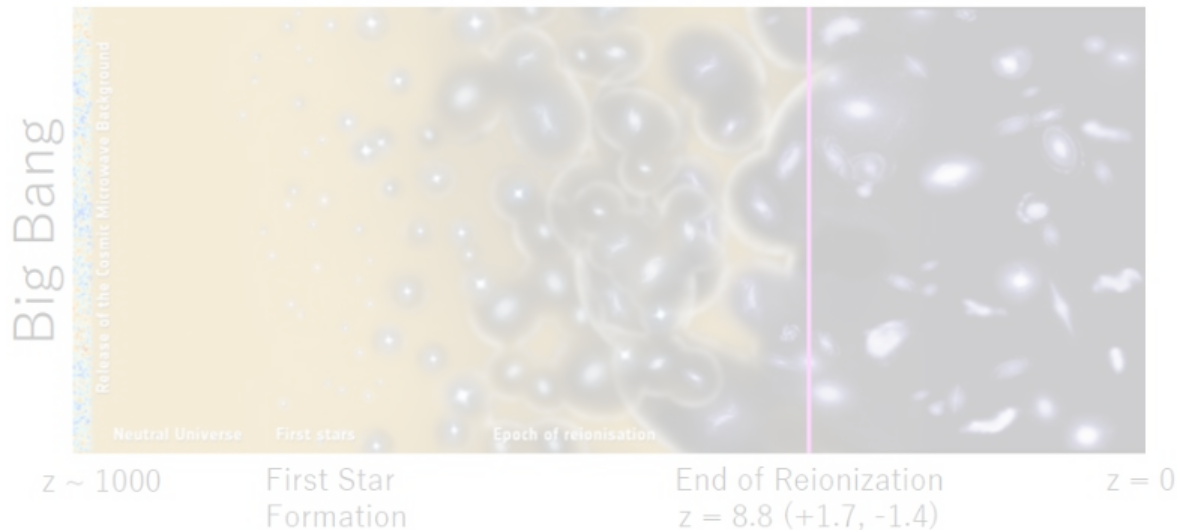
- The **most luminous explosions** in the Universe, releasing of energy on the order of 10^{52-54} erg lasting from 10 msec to 100 sec.
- Observed even in the early universe !

They are **expected to serve as luminous probes of the early Universe.**



Credit: NASA Goddard Space Flight Center

Key Science



Credit: ESA/ Planck

Main Targets

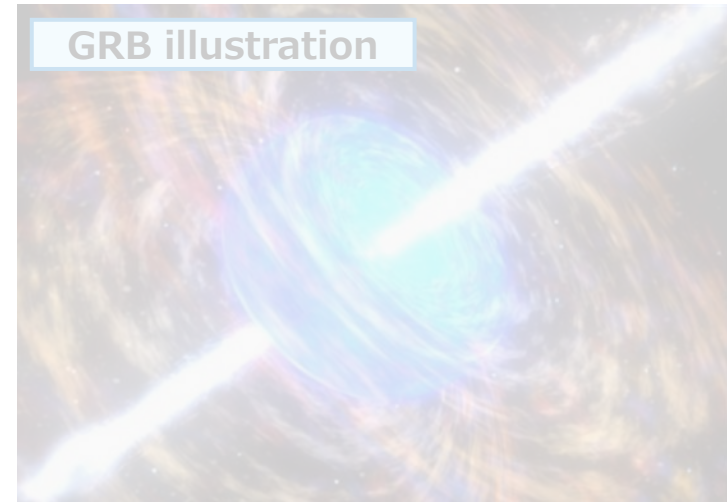
- (1) History of Star Formation
- (2) History of heavy element
- (3) First-generation stars

Gamma-Ray Burst (GRB)

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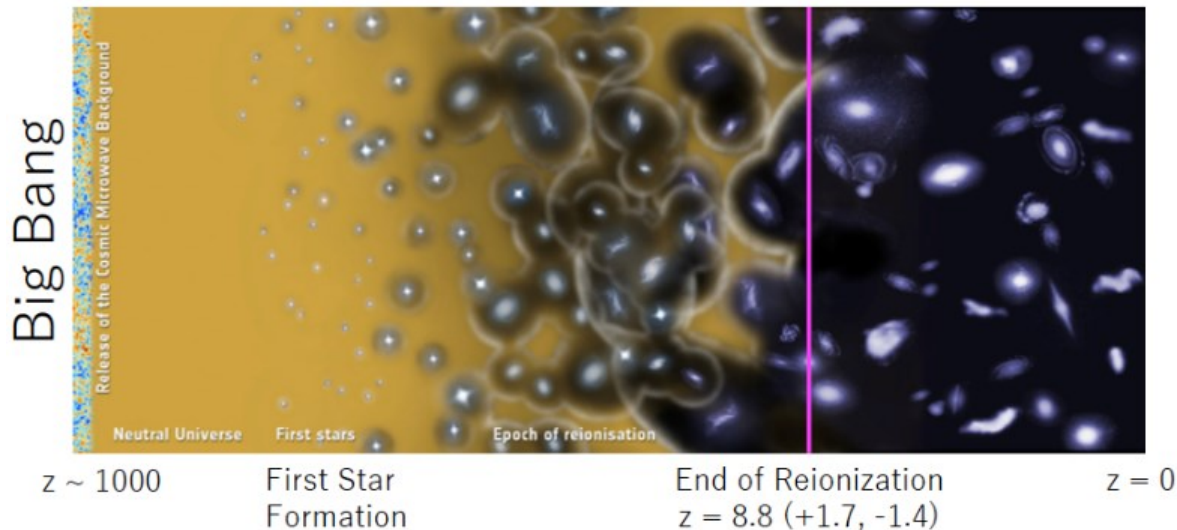
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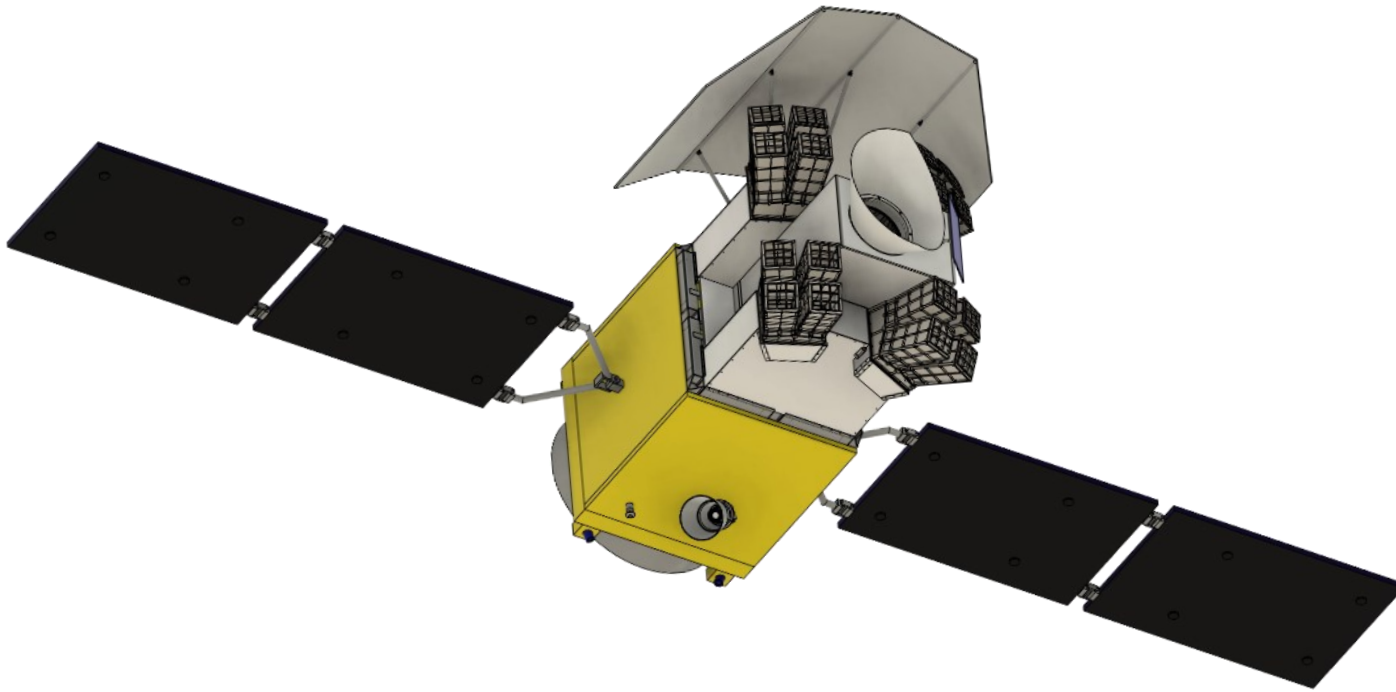
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HiZ-GUNDAM

High- z Gamma-ray bursts for Unraveling the Dark Ages Mission



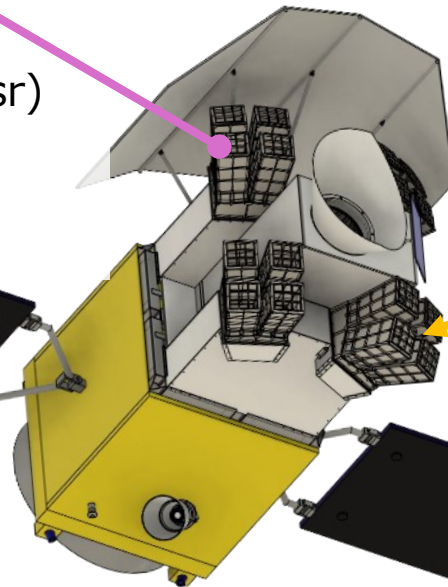
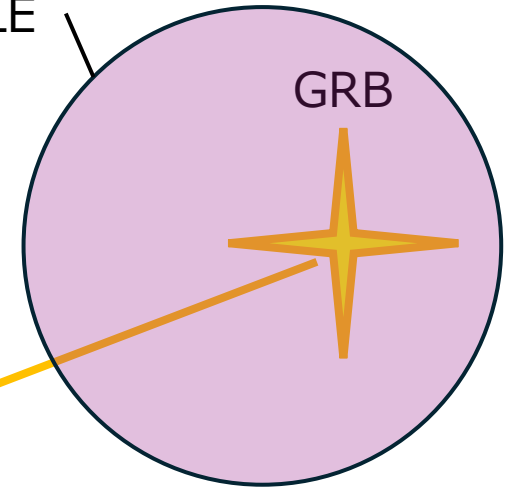
HiZ-GUNDAM

High- z Gamma-ray bursts for Unraveling the Dark Ages Mission

Exploration of Ancient GRBs with Lobster Eye (EAGLE)

- Soft X-ray (0.4 – 4 keV)
- Wide Field of View (0.53 sr)
- Localization accuracy of ~ 3 arcmin to detect GRBs.

Localization by EAGLE



X-ray from GRB

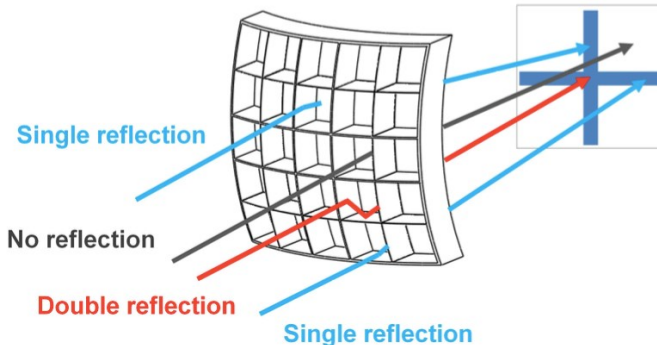
Lobster Eye Optics

Focal plane detector
→ pnCCD

Readout system

300mm

Focal plane



Credit: ESA

HiZ-GUNDAM

High- z Gamma-ray bursts for Unraveling the Dark Ages Mission

Exploration of Ancient GRBs with Lobster Eye (EAGLE)

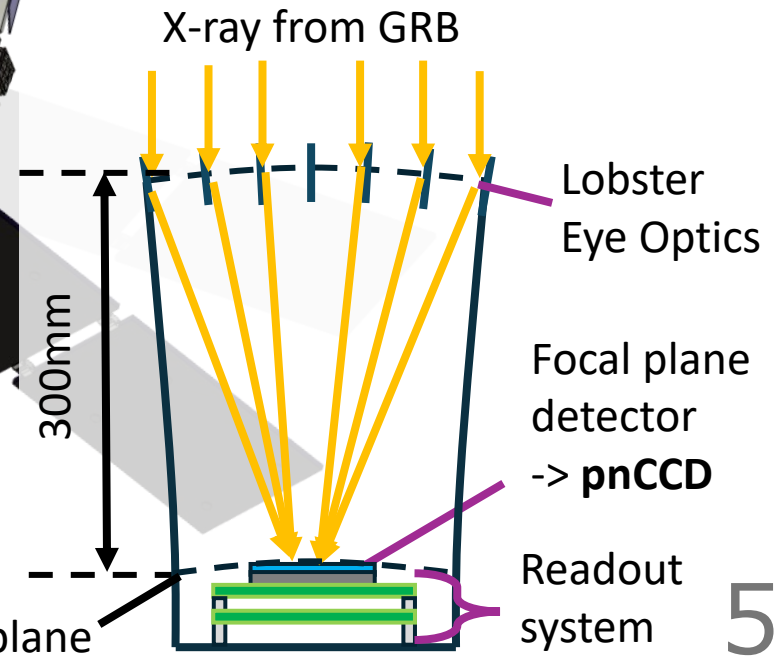
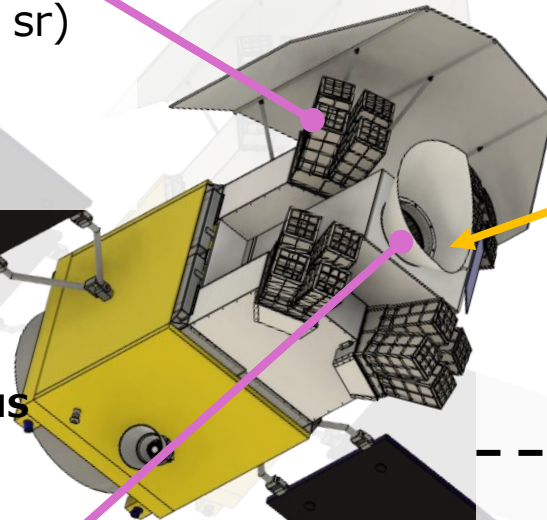
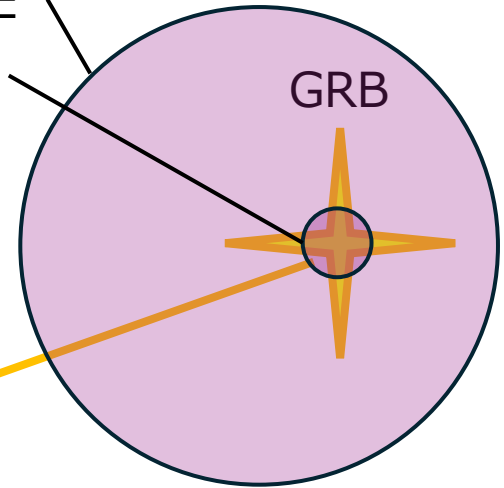
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Multi-band Optical and Near-infrared Simultaneous Telescope for Efficient Response (MONSTER)

Follow-up observations of GRBs detected by EAGLE in visible and near-infrared light will measure:

- Coarse redshifts
- More precise positions within arcsec

Localization by EAGLE
Localization by MONSTER
auto point
the telescope



HiZ-GUNDAM

High- z Gamma-ray bursts for Unraveling the Dark Ages Mission

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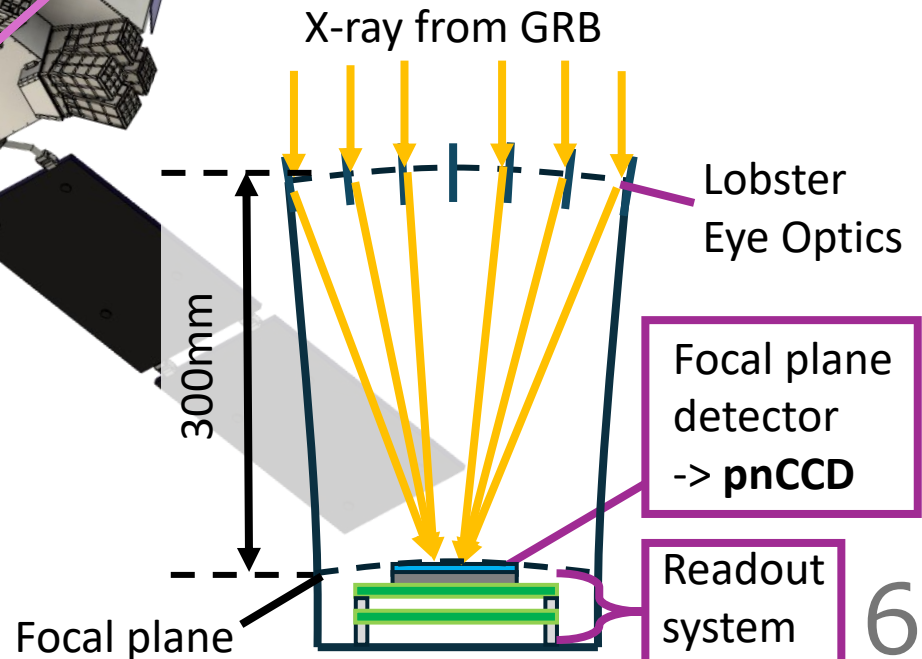
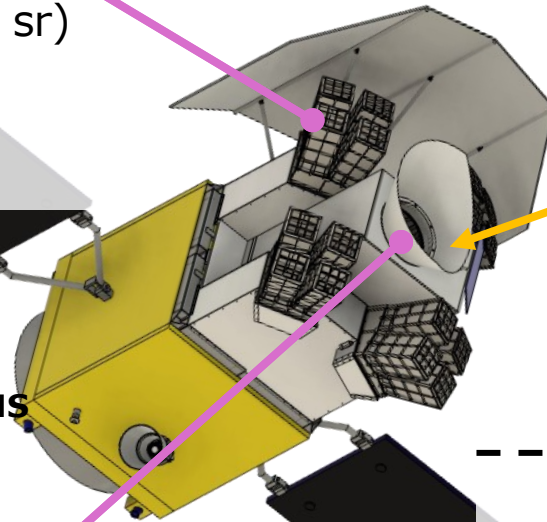
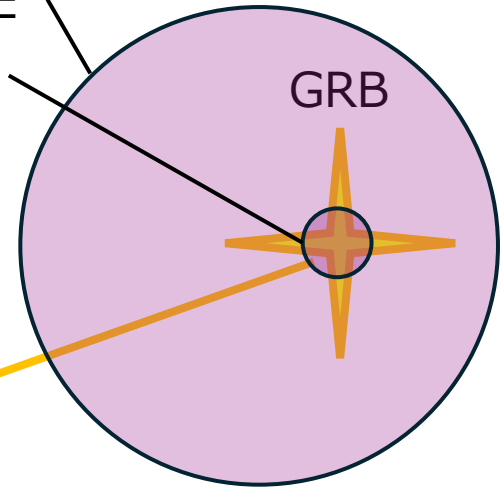
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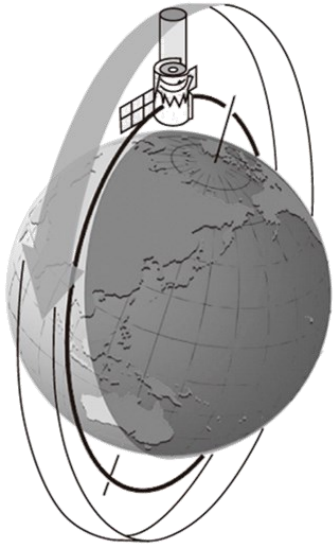
- Coarse redshifts
- More precise positions within arcsec

Localization by EAGLE
Localization by MONSTER



Charged Particle Problem

The HiZ-GUNDAM satellite repeatedly passes through the South Atlantic Anomaly (SAA) and high-latitude regions, exposing it to high-dose charged particles multiple times per day.



HiZ-GUNDAM orbit:

sun-synchronous polar orbit

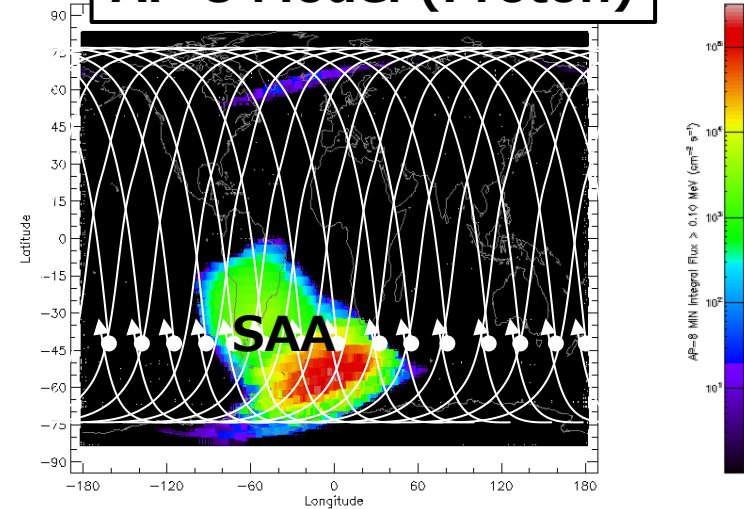
Altitude: ~ 600 km

Inclination angle: $\sim 98^\circ$

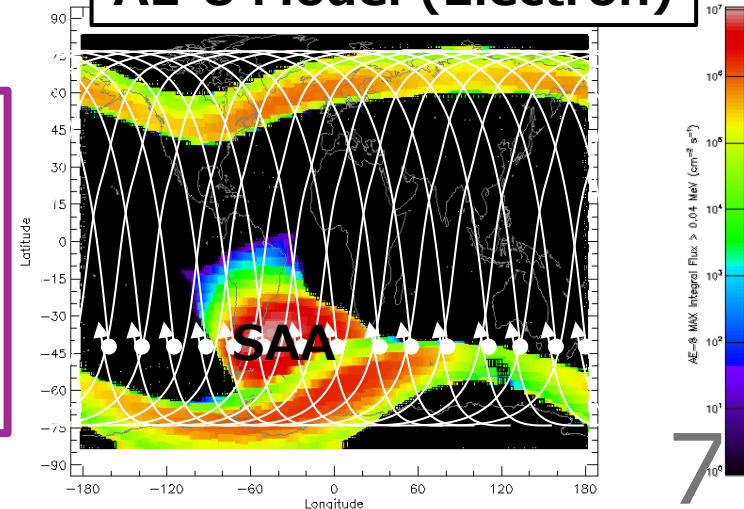
Period: ~ 1.5 hours

- Charged particles events can cause False-GRB triggers.
- It is necessary to minimize charged particle events as much as possible on focal plane detector.

AP-8 Model (Proton)



AE-8 Model (Electron)

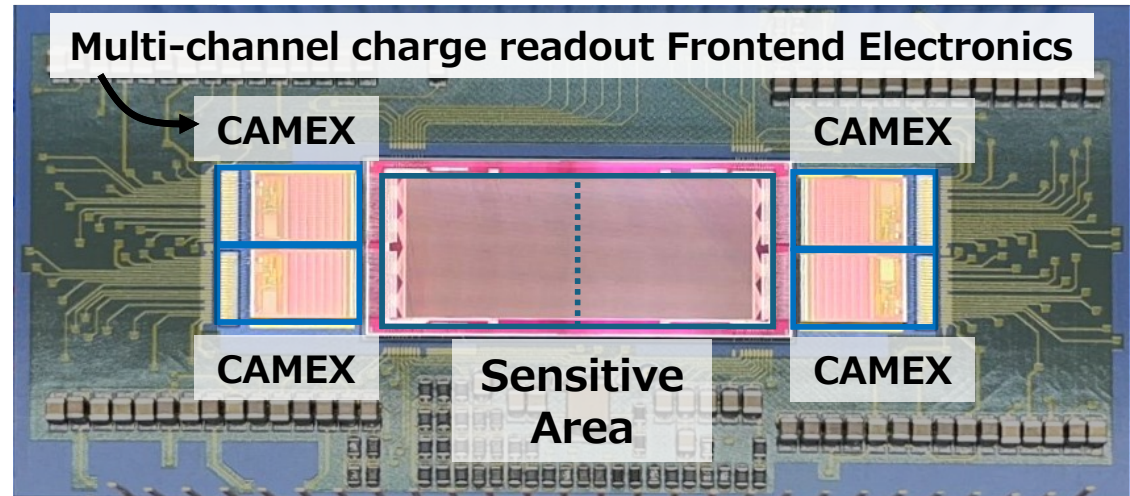
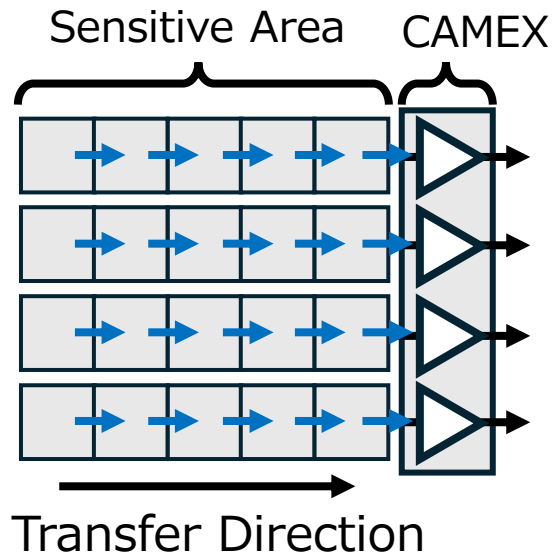


Focal Plane Detector: pnCCD Image Sensor

manufactured by PNSensor GmbH.

Features

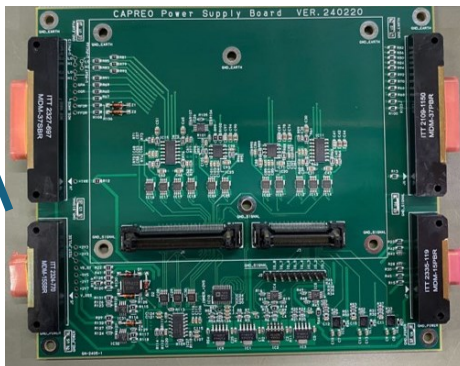
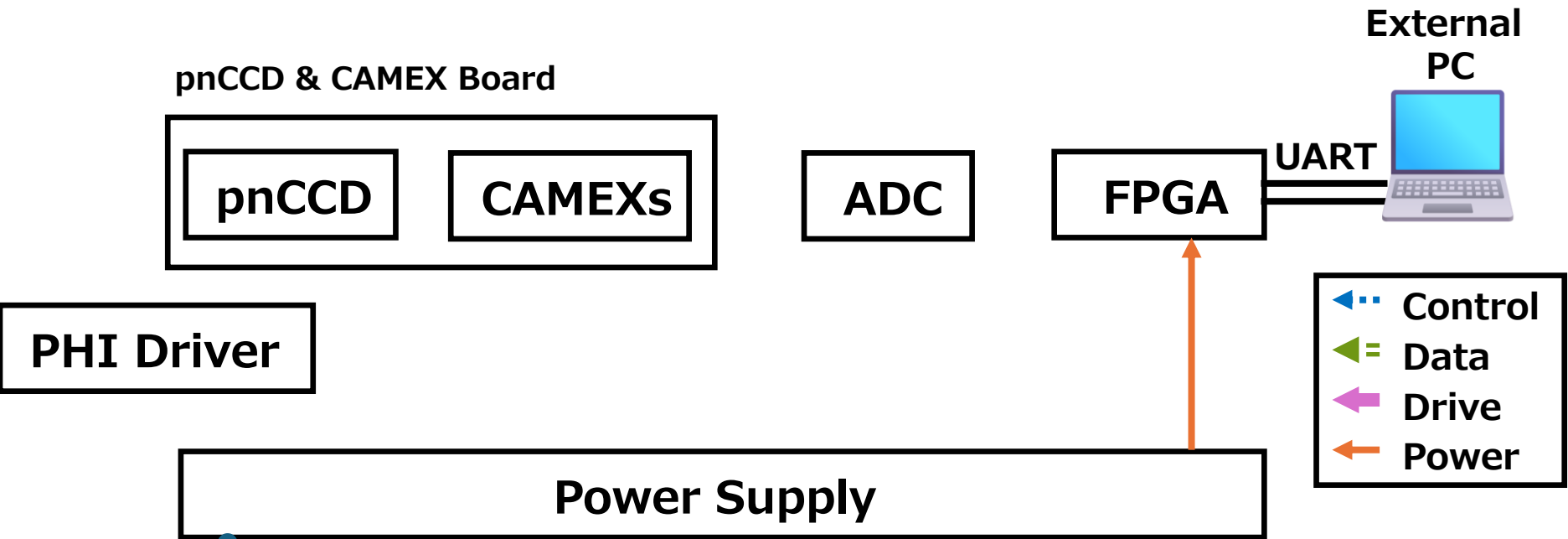
- Silicon pixel sensor
- Fully depleted $\sim 450 \text{ um}$
- Back-illuminated for Soft X-ray.
- Large sensitive area
- High frame rate!



Items	Requirement	pnCCD for satellite
Energy Range	0.4 – 4 keV	0.3 – 11 keV (quantum eff. >90 %)
Sensitive Area	$\geq 55 \times 55 \text{ mm}^2$	$55 \times 55 \text{ mm}^2$
Pixel Size	$\sim 100 \text{ um}$	107 um
Frame Rate	$\geq 10 \text{ fps}$	up to 1000 fps

- **The pnCCD specifications fully meet the requirements!**
- **Onboard processing must be sufficiently faster than the frame rate, with 1 msec per frame being adequate.**

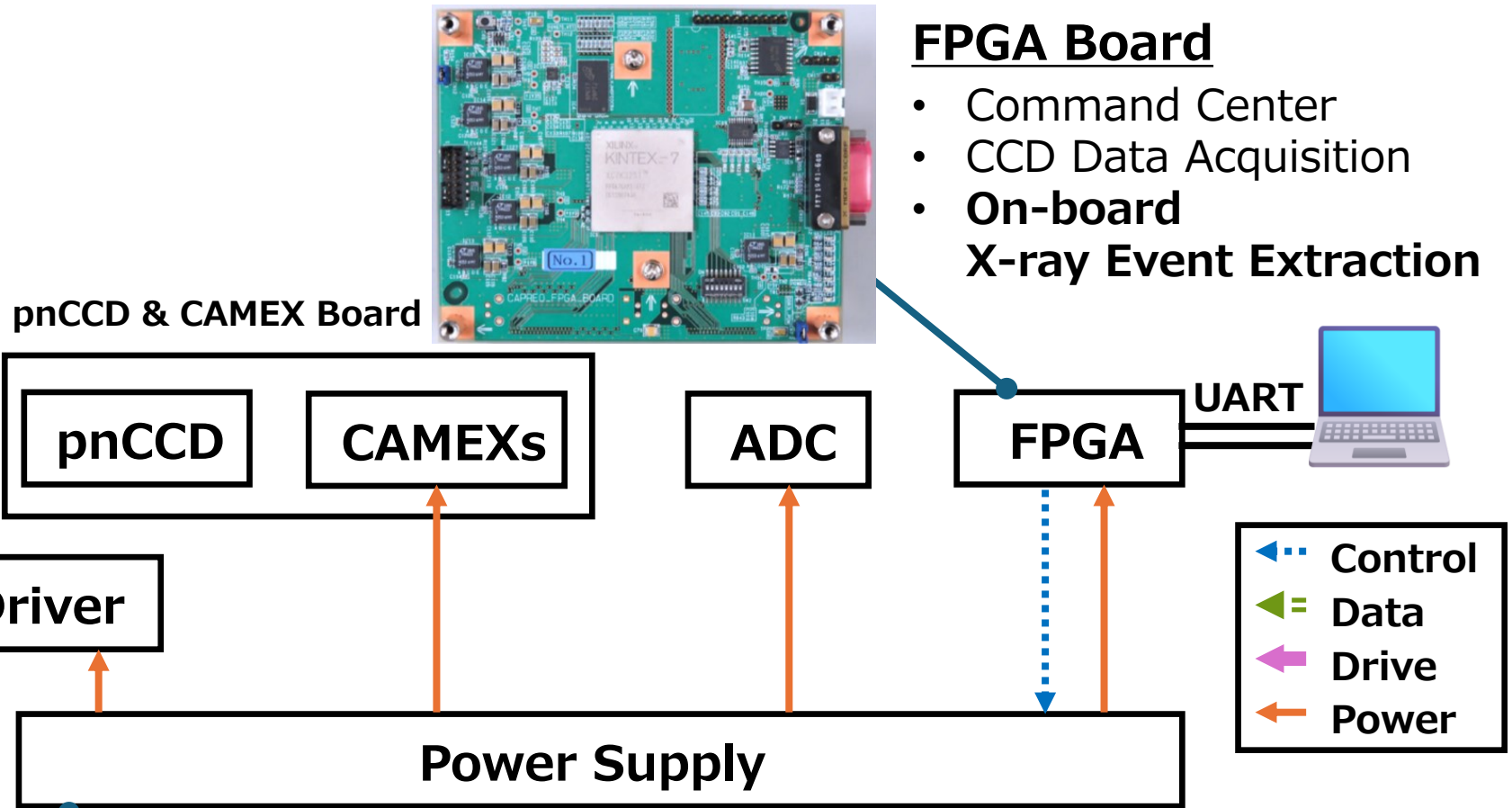
pnCCD Drive & Readout Electric System



Power Supply Board

- **Digitally controllable voltage**
- Features DAC, Op-Amp, and LDO regulator

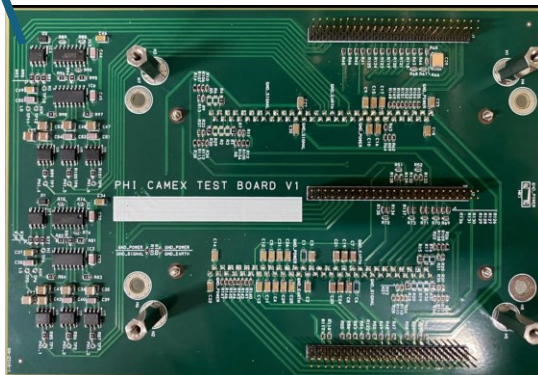
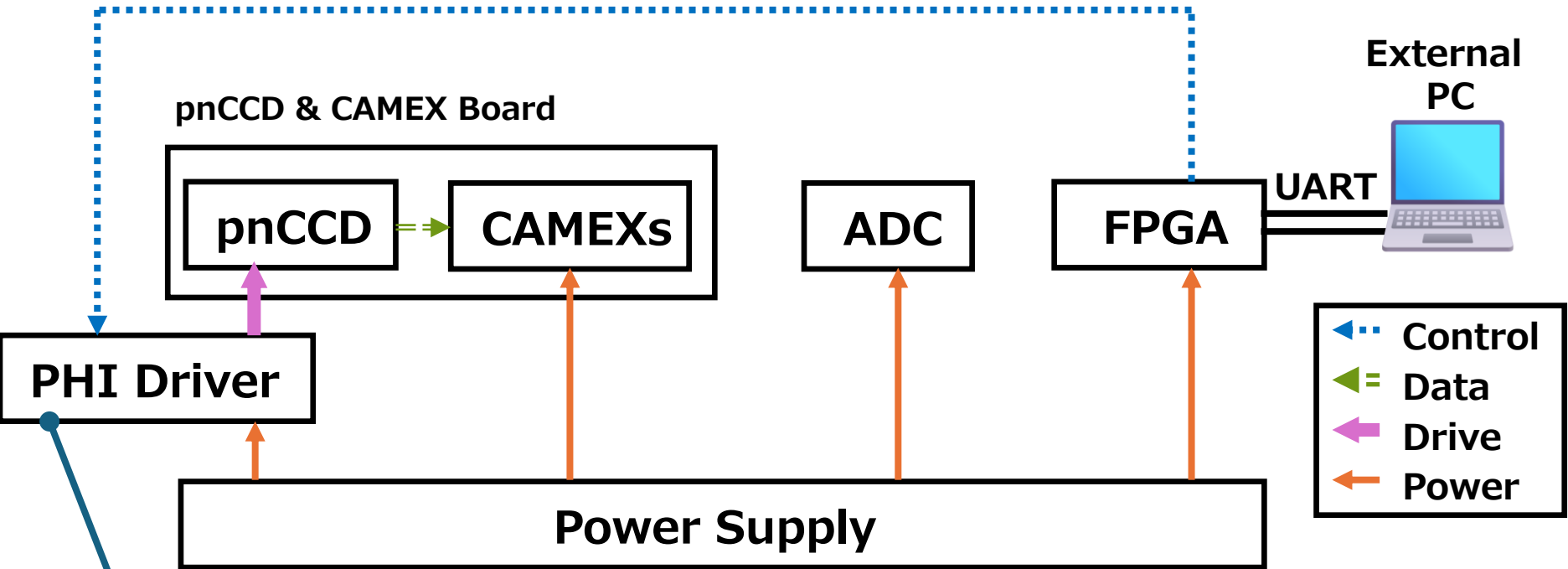
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Power Supply Board

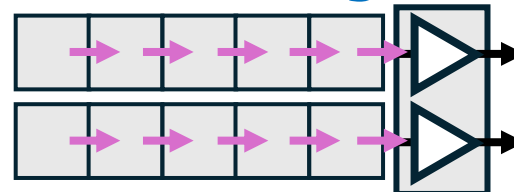
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pnCCD Drive & Readout Electric System

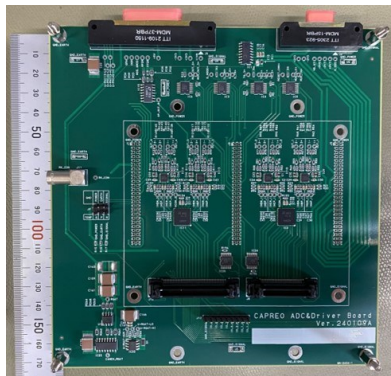
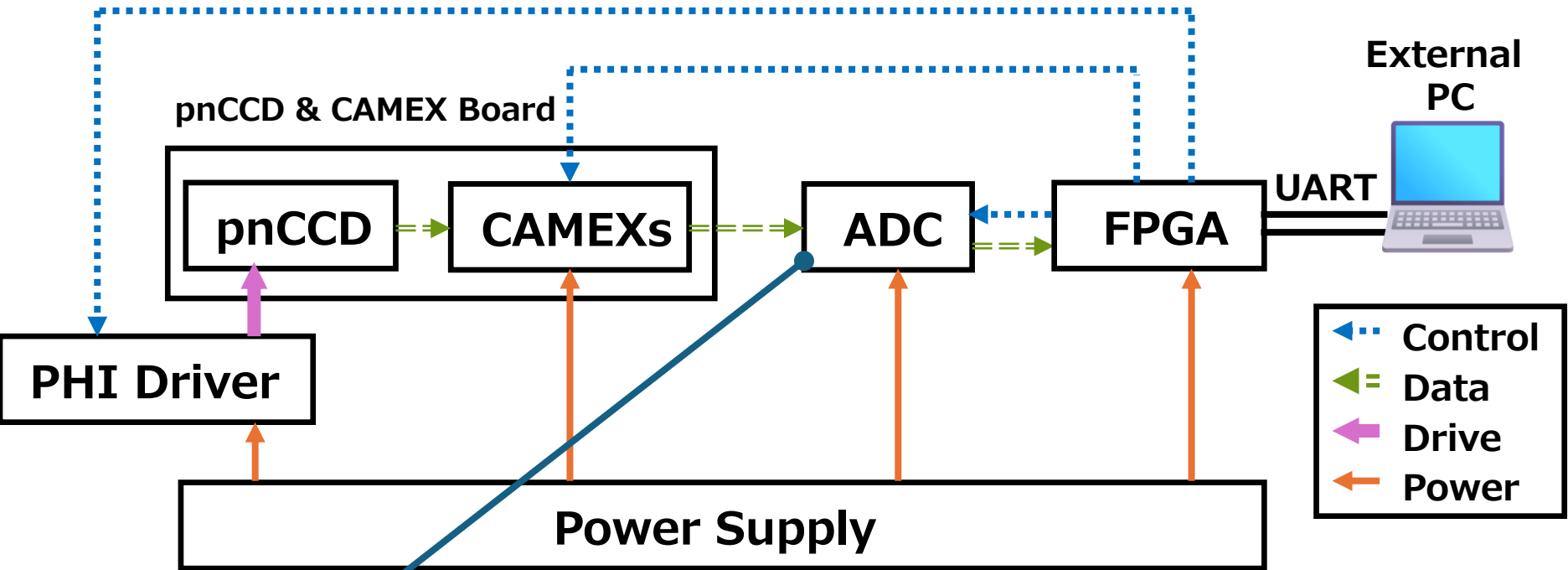


PHI Driver Board

- Generates **analog pulses** for **charge transfer** from **digital signals**.



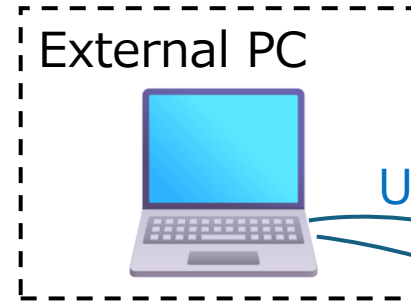
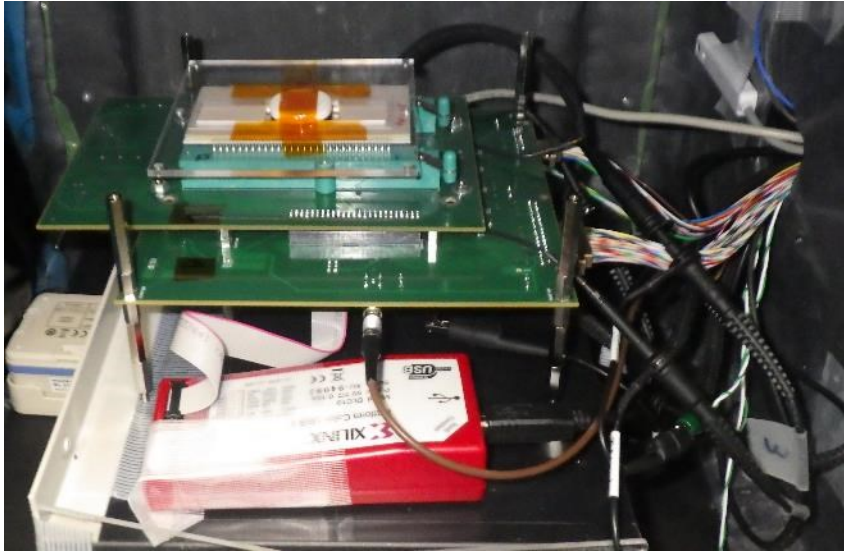
pnCCD Drive & Readout Electric System



ADC Board

- Converts analog data output from CAMEX to digital data.
- Passes the data to the FPGA.

Our Experimental Setup



$\pm 3.3 \text{ V}$,
 $+5 \text{ V}$, $+5.3 \text{ V}$,
 -27.5 V

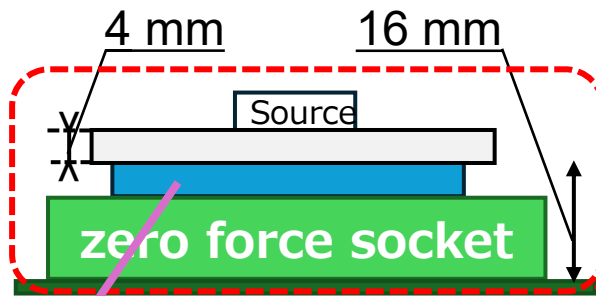
DC Power
Supplies

Hole for Cables

Power Supply Board

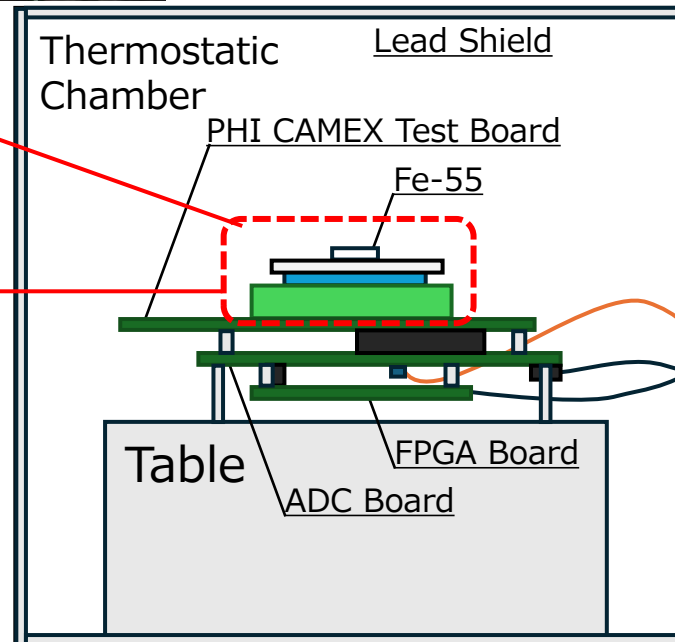
FPGA Board

HV module(NIM)
-250 V



pnCCD image sensor

Sensitive Area	12.7 x 25.3 mm ²
pixel size	132 μm
Depletion Layer	450 μm
Bias	-250 V

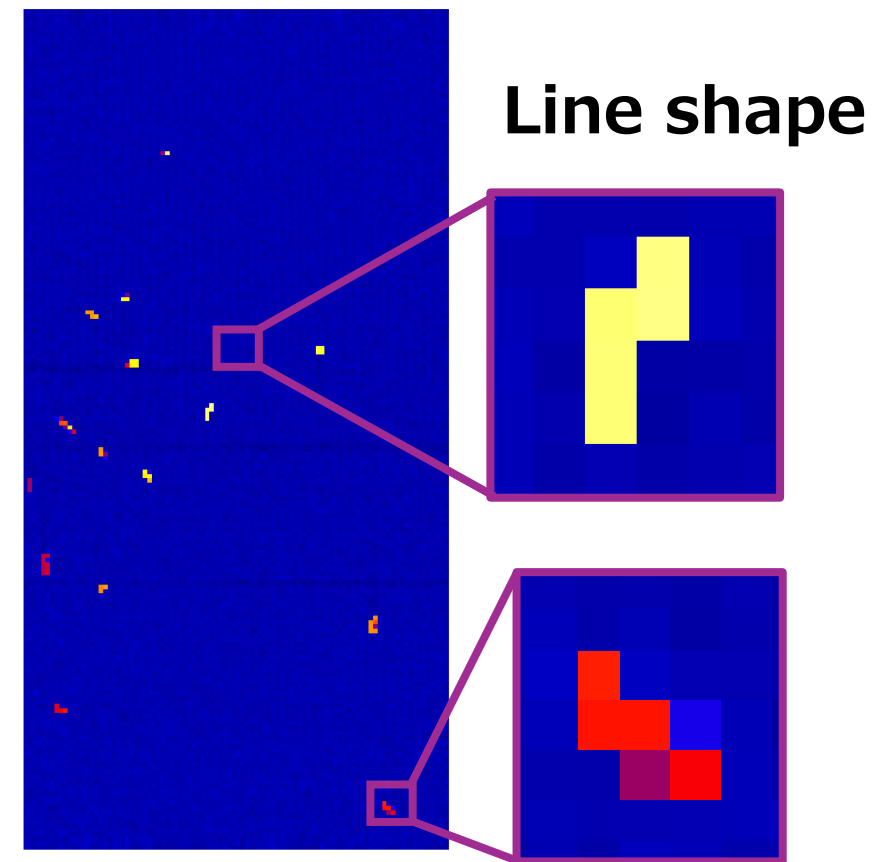
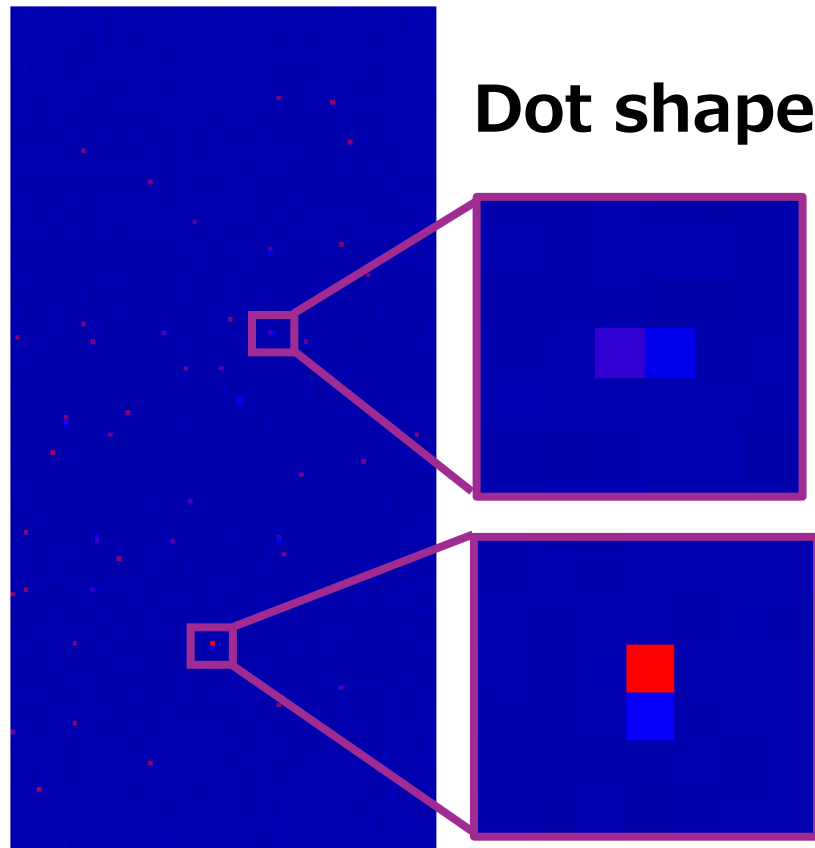



sensor was put into the chamber. (0 °C)

X-ray and β -ray Data

X-ray (Fe-55), Temperature = 0 °C,
Integration Time = 20 ms
Data sets: 10 frames \times 2,
100 frames \times 1

β -ray (Sr-90), Temperature = 0 °C
Integration Time = 25 ms
Data sets: 100 frames \times 2



ADU:  0 2000 4000 6000 8000 10000 12000 14000 16000

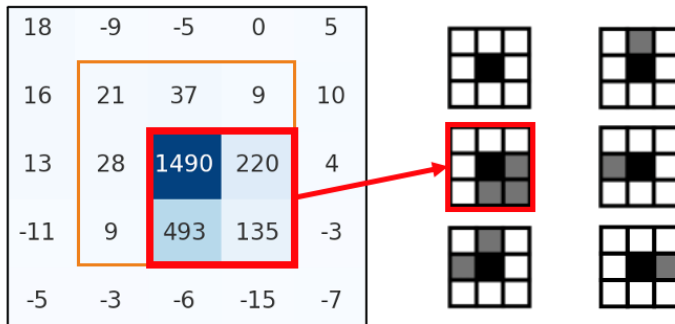
Classical Method: X-ray Event Extraction

Grade Classification

- Classify and extract event propagation patterns using event thresholds (E_{th}) and split thresholds (S_{th}).
- Events exceeding the particle threshold (P_{th}) are removed as particle events.
- 3×3 pixels grade, 5×5 pixels grade
- X-ray events are Grade 0, 2, 3, 4, 6**

Example of event extraction

$E_{th} = 200$, $S_{th} = 100$

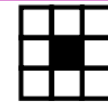


This X-ray event signal
 $= 1490 + 220 + 493 + 135 = 2338$

[Definition]

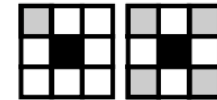
[Examples]

Grade 0
= perfect single

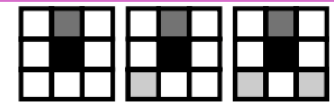


 **Extract as X-ray**

Grade 1
= single
+ detached corners



Grade 2
= vertical single-sided split
+ detached corners



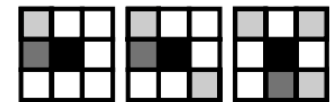
Grade 3
= left single-sided split
+ detached corners



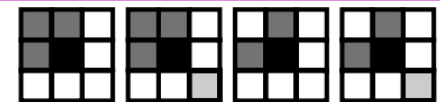
Grade 4
= right single-sided split
+ detached corners






Grade 5
= single-sided split
with touched corners

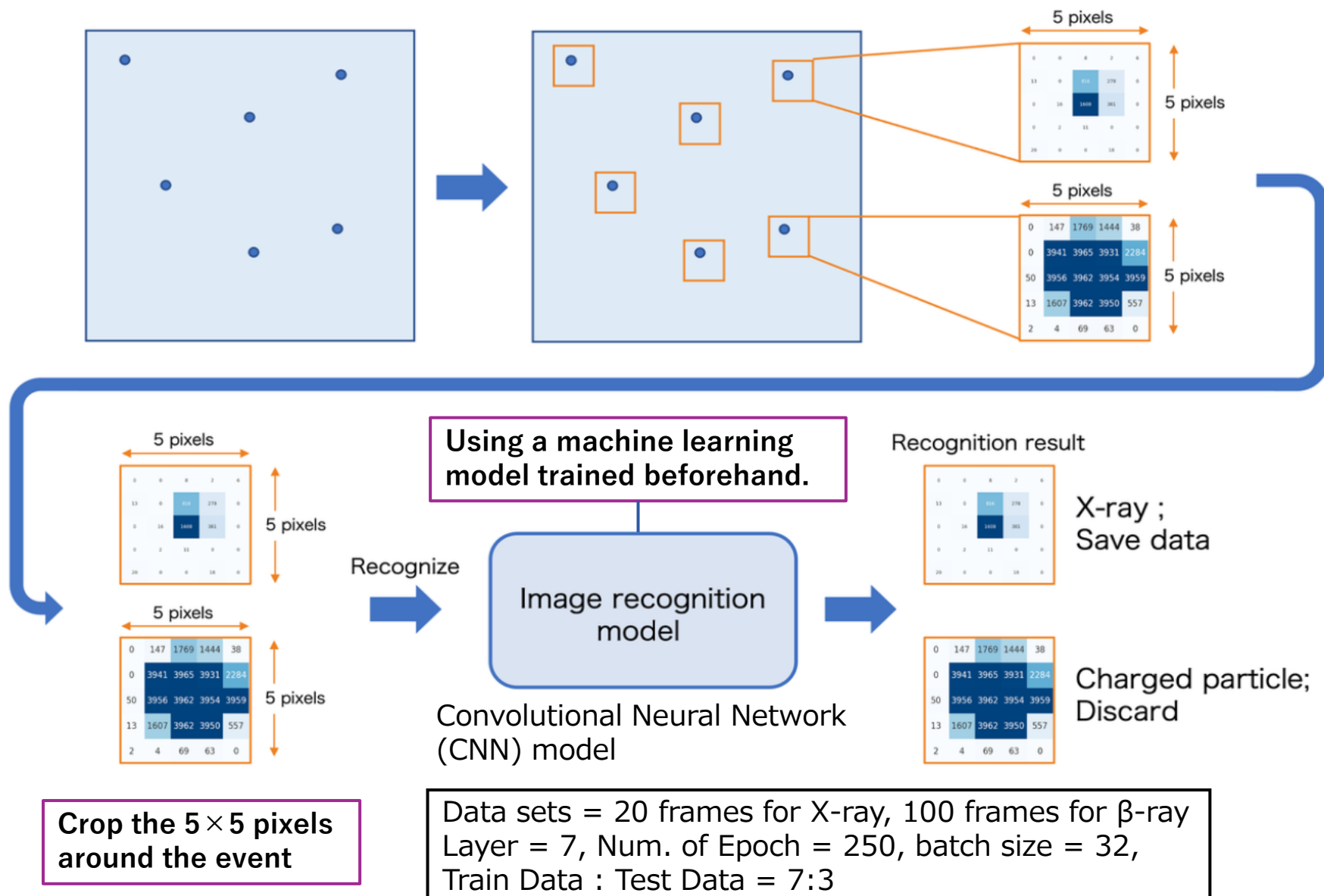


Grade 6
= L-shape or square-shape
+ detached corners



-  The center pixel.
-  A pixel whose PH level is larger than the split threshold and which is included when summing up the PHs.
-  A pixel whose PH level is larger than the split threshold and which is not included when summing up the PHs.

Machine Learning Method



Comparison of β -ray Rejection

- Results from applying methods to Sr-90 data:

Integration time = 25 msec, # of frames = 100 (separate from training data)

Original

- This event map contains a large number of charged particle events.
- Among the 100 frames, a total of **1,893 β -ray events** were detected.

ADU:

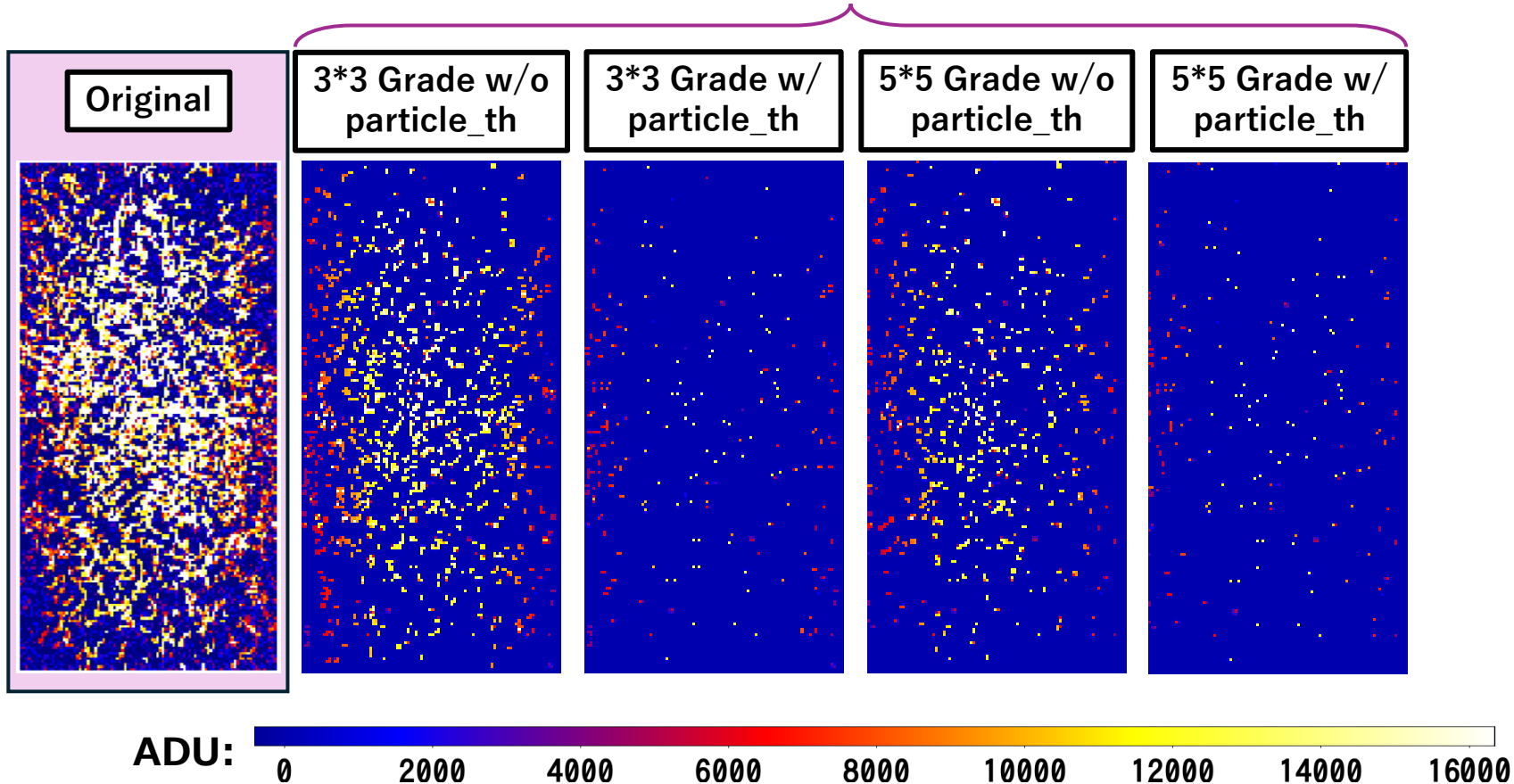


Comparison of β -ray Rejection

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Charged particle events have been reasonably eliminated, but some still remain.

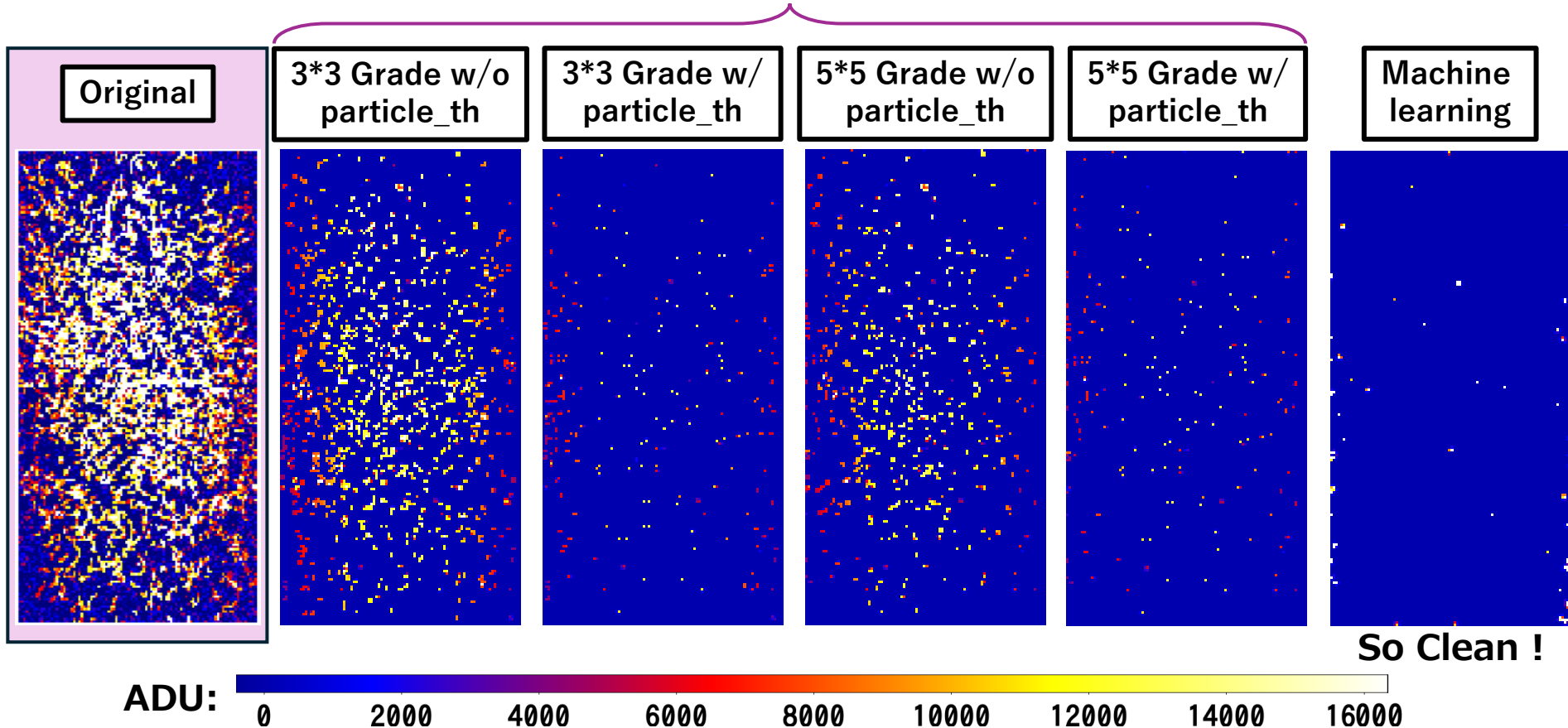


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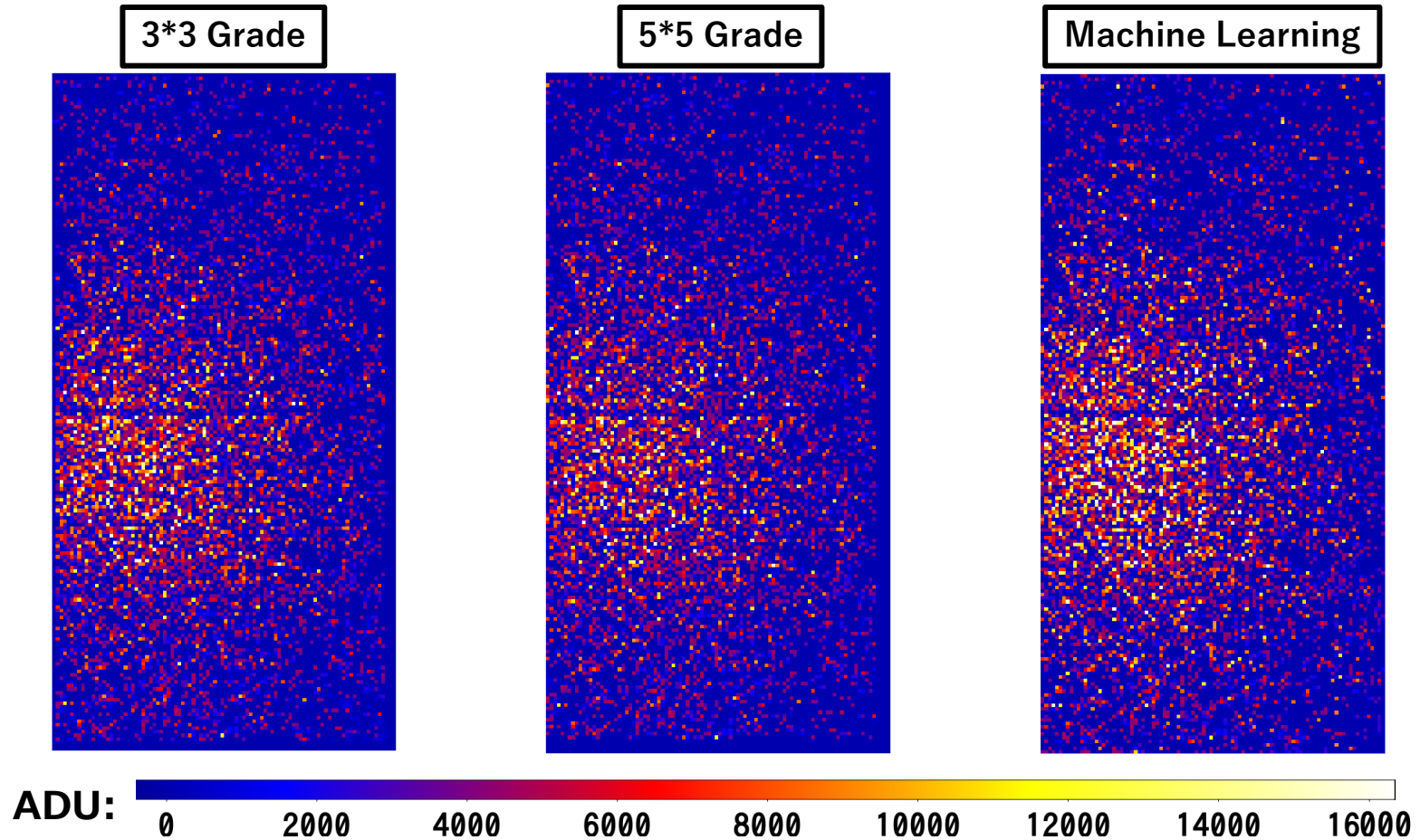


The Machine Learning (ML) method demonstrates visually superior charged particle rejection performance.

Comparison of X-ray Extraction

- Results from applying methods to Fe-55 data:







Integration time = 20 msec, # of frames = 100 (separate from training data)



Visually, all methods are successfully extracting the X-ray events.

Comparison of Results

- ✓ While the grade method achieves only 10% removal efficiency, its processing is simple, requiring < 1 msec/frame.
- ✓ The machine learning method boasts an extremely low removal rate of 2.3%, but its processing time is 5-10 times slower than the grade method.

Methods	β -ray data set			X-ray data set		
	False X-ray [count]	"Misclassification Rate"* (as low as possible)	Processing Time (CPU) [msec/frame] < 1 msec / frame is sufficient	X-ray Extraction Rate (as high as possible)	Particle Rejection Performance	Feasibility on FPGAs
3×3 grade w/o p_th	999	52.8 %	0.739	99 %		
3×3 grade w/ p_th	226	11.9 %	0.366			
5×5 grade w/o p_th	499	26.3 %	0.848	95 %		
5×5 grade w/ p_th	193	10.2 %	0.924			
Machine Learning	43	2.3 %	5.50	97 %		

Note1. Using **100 frames** of data.

Note2. Among the 100 frames, a total of 1,893 beta-ray events were detected.

The misclassification rate is defined as: **(Num. of false X-ray events) / 1,893.**

Summary

- **Onboard algorithm is essential for HiZ-GUNDAM** to prevent false GRB triggers from particle noise.
- Traditional Grade method has a relatively high misclassification rate (11.9%).
- Machine Learning method is superior, reducing the **“misclassification rate” to 2.3%** while maintaining 97% X-ray efficiency.
- Machine learning methods (with CNN model) are **5 to 10 times** slower than conventional methods.

Conclusion & Future Work

Conclusion

- For risk mitigation, the reliable "Grade method" will be implemented as the baseline system.
- The key result is that the ML method shows a clear path to achieving both high accuracy (2.3 %) and realistic processing speeds.

Future Work

- Currently, monochromatic X-ray sources are used.
→We will also use sources of other energies to validate the ML method model.
- To maximize the mission's observation efficiency, we also aim to implement the ML method.
- Investigate faster and lighter models with the goal of implementing them on FPGAs.

Thank you for your attention!



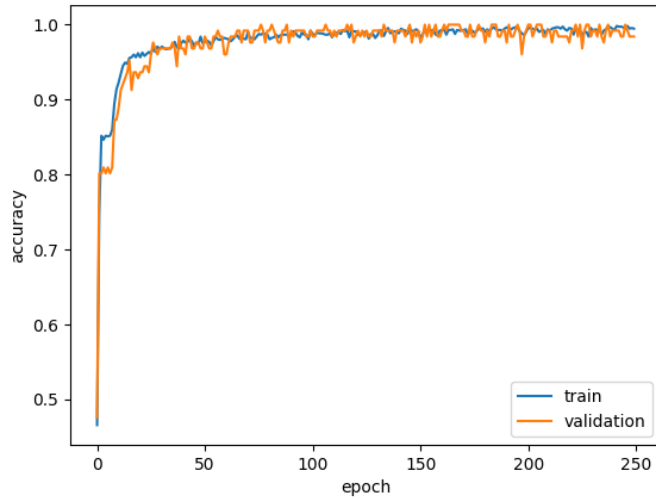
QR code:
You can send
me an e-mail

ryuji_kondo07@stu.kanazawa-u.ac.jp

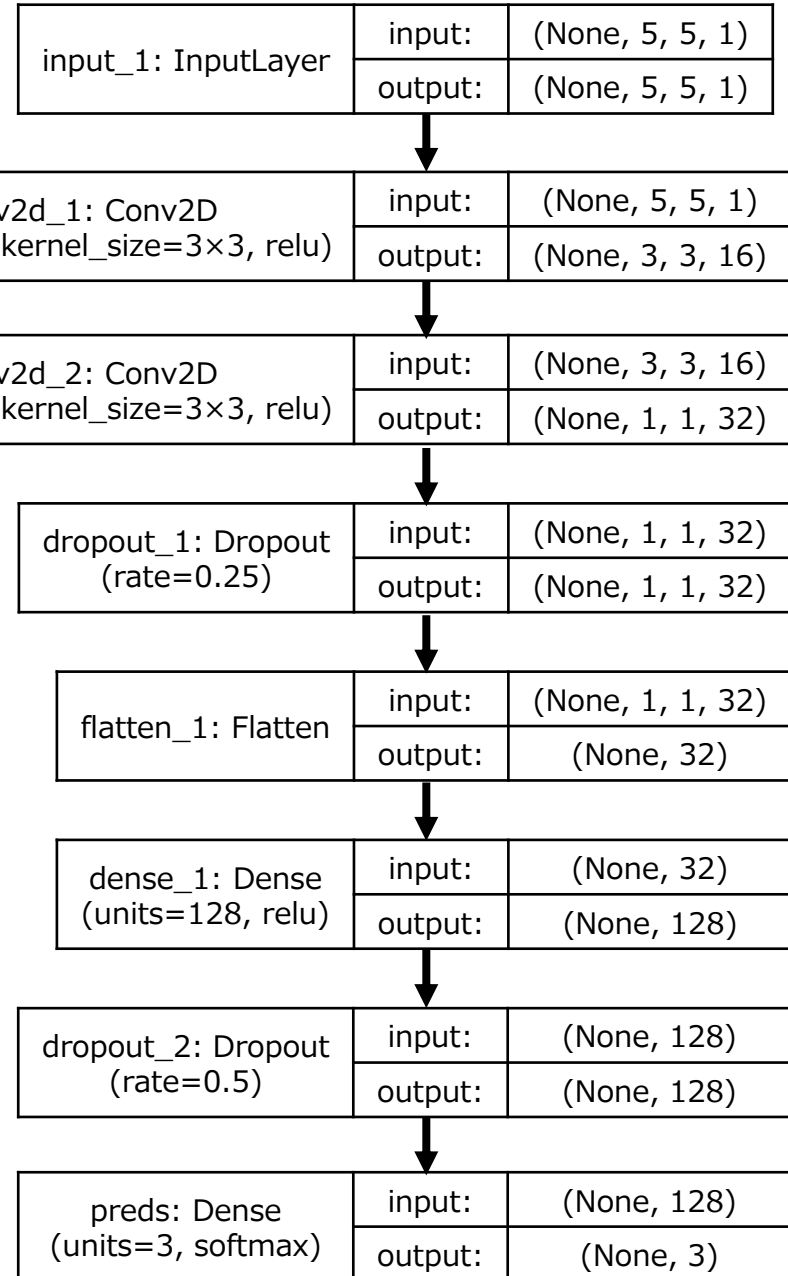
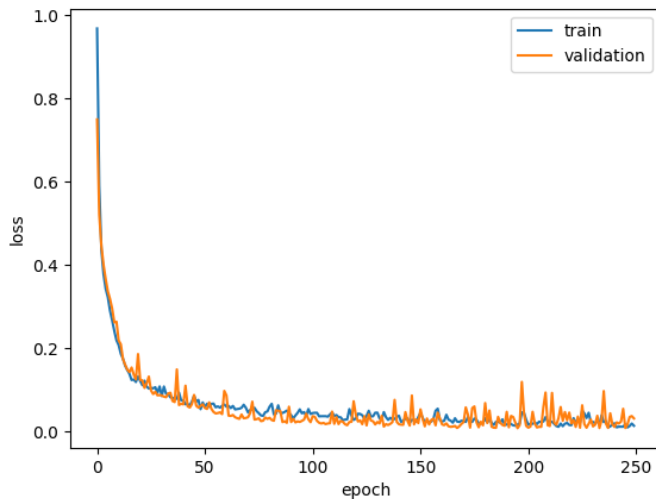
APPENDIX

Trained Model

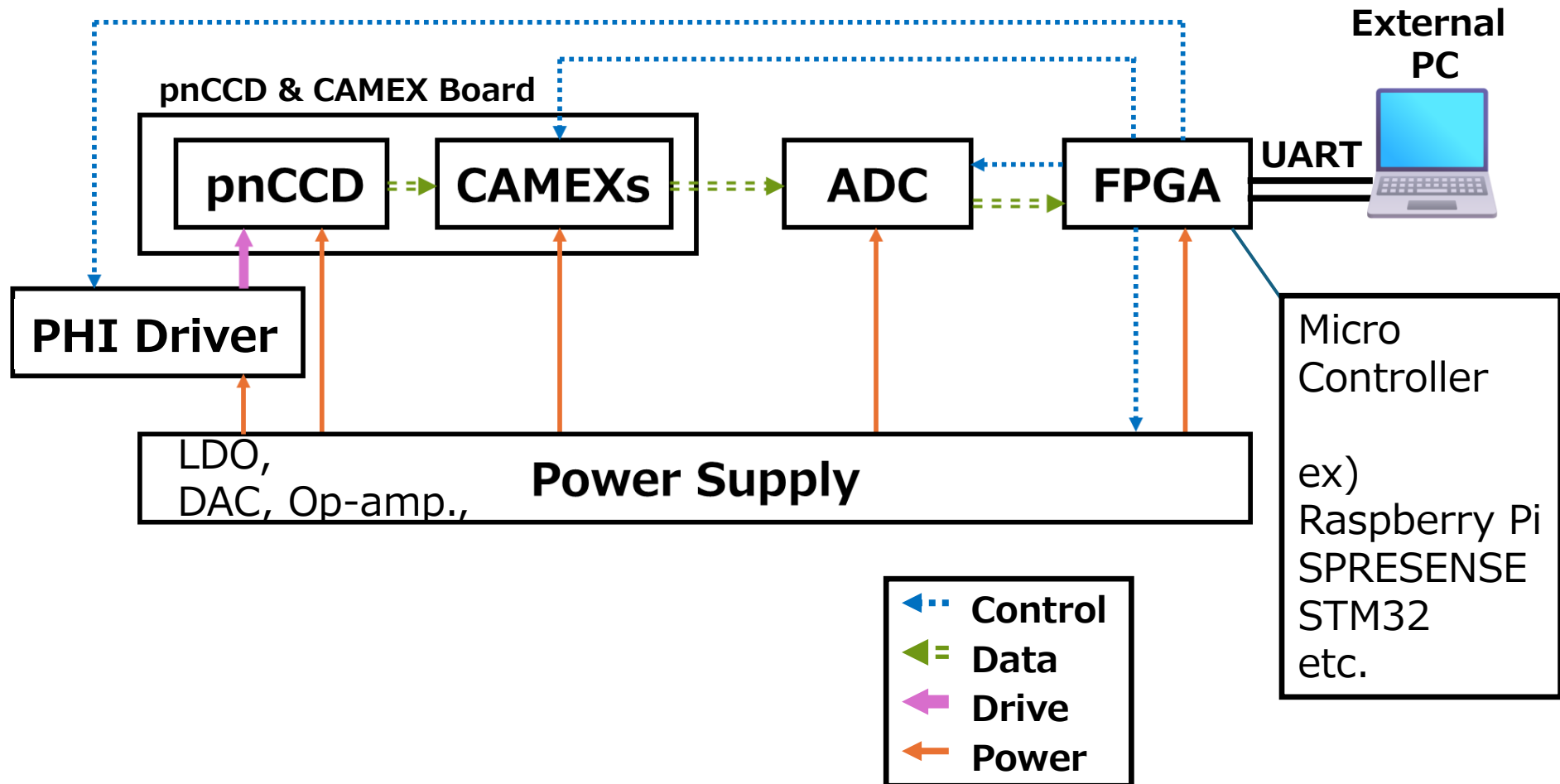
Accuracy



Loss



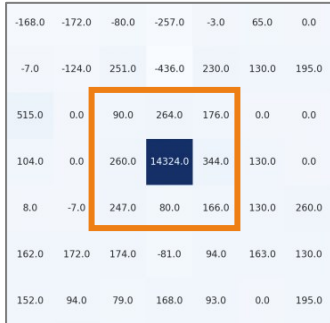
Next System



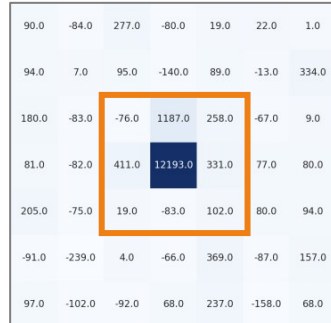
3x3 Pixel Grade False Classification

□ = Event Detection Area

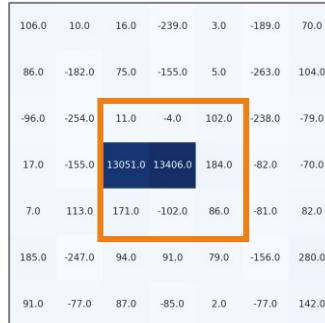
Grade 0



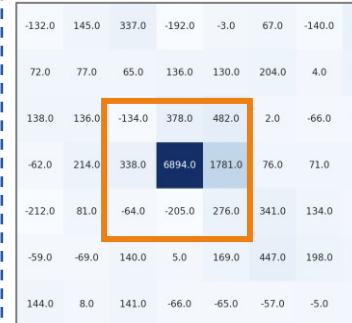
Grade 2



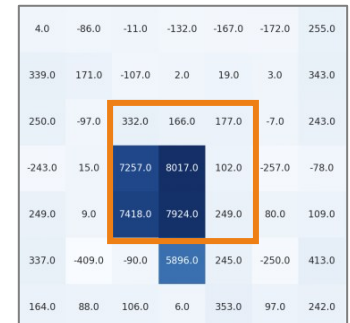
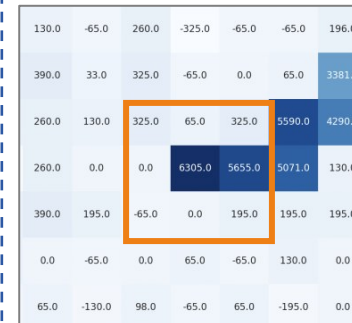
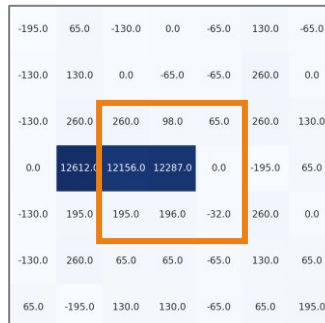
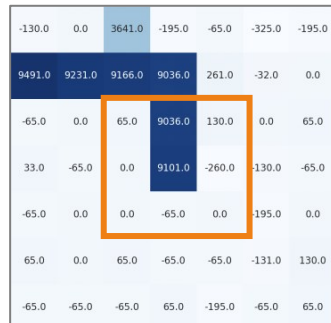
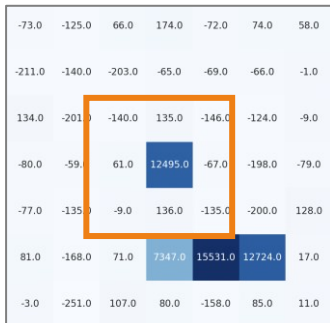
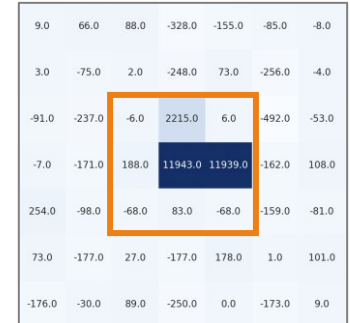
Grade 3



Grade 4



Grade 6



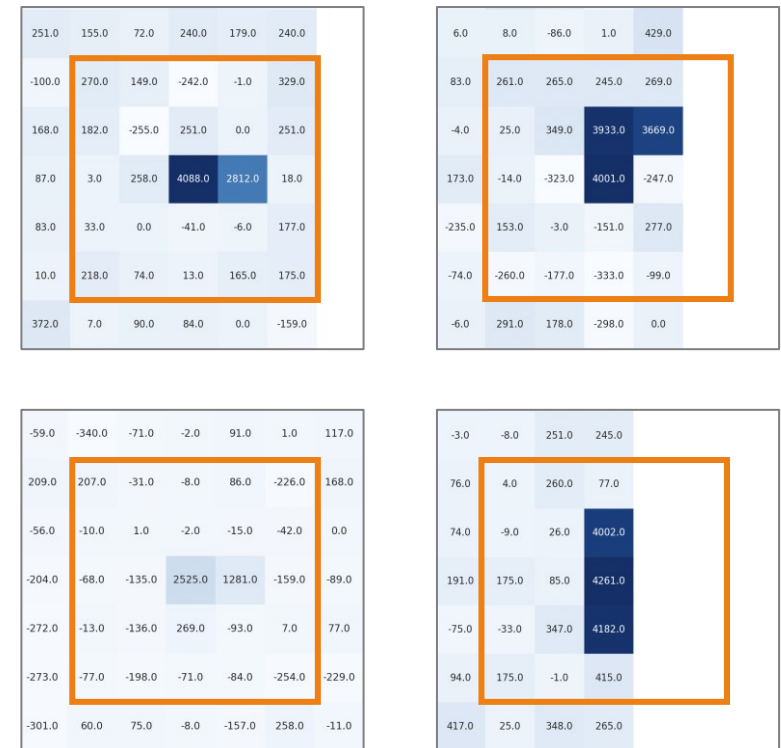
Machine learning

 = Event Detection Area

Single pixel event



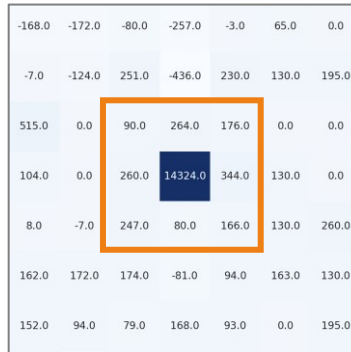
Multi Pixel Event



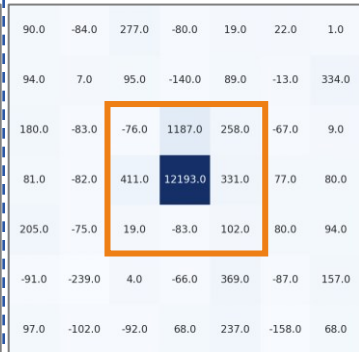
3×3 pixels Grade

 = Event Detection Area

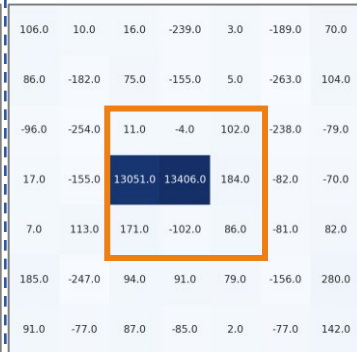
Grade 0



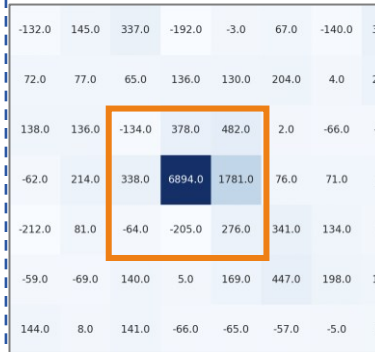
Grade 2



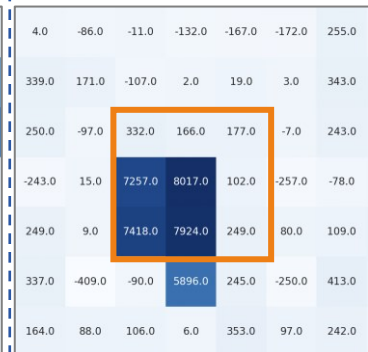
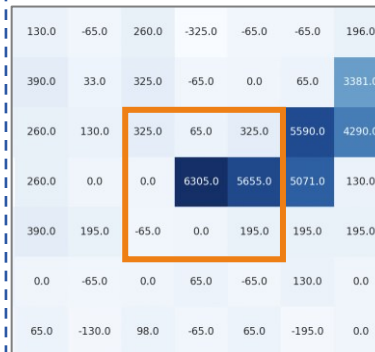
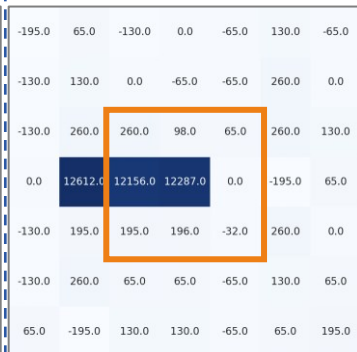
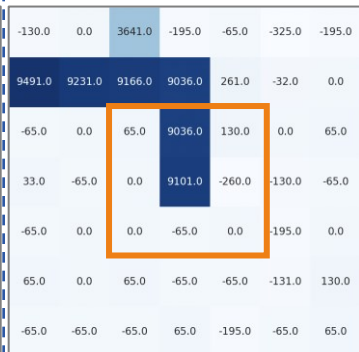
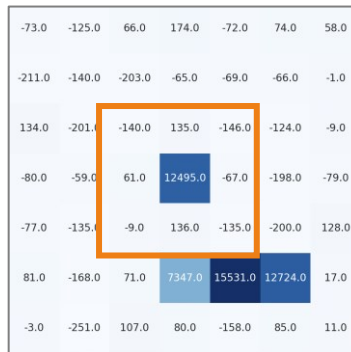
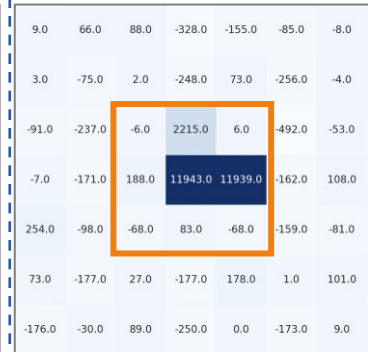
Grade 3



Grade 4



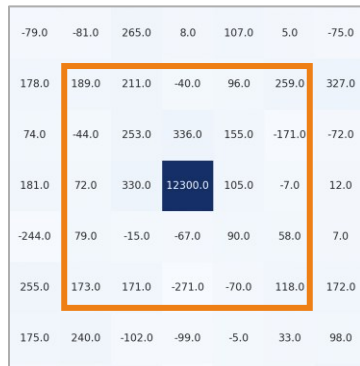
Grade 6



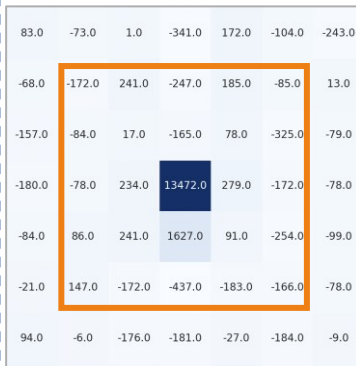
5 × 5 pixels Grade

 = Event Detection Area

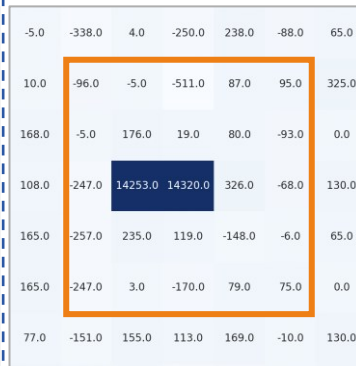
Grade 0



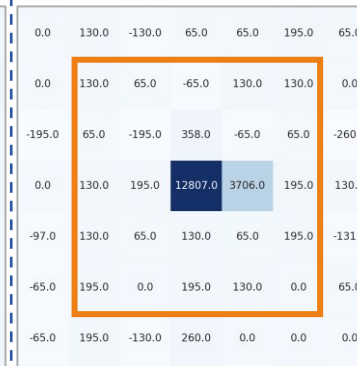
Grade 2



Grade 3



Grade 4



Grade 6

