



Visualization and Analysis of Trajectories of Particles using Nuclear Emulsion and Microscopy

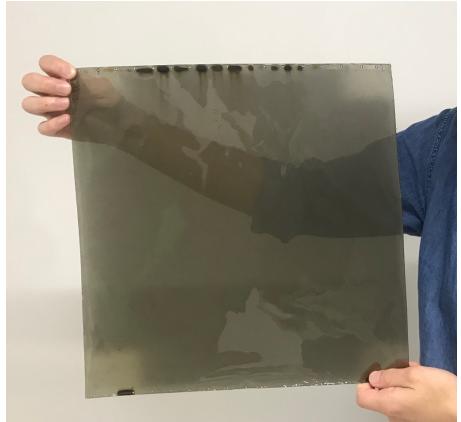
Ayumi Kasagi

Rikkyo University, Graduate School of Artificial Intelligence and Science
QBI 2023 09/29

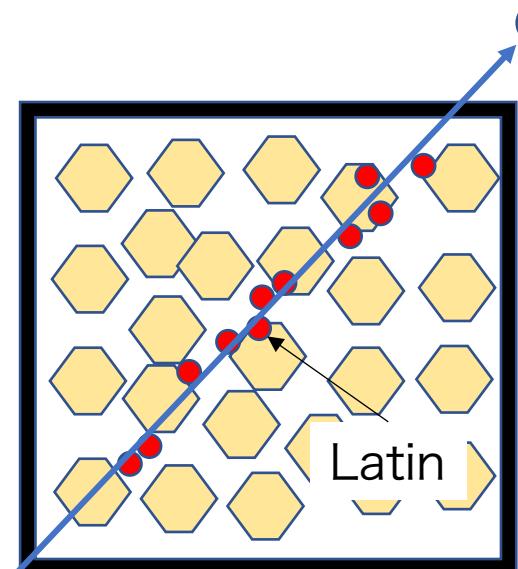
Photographic film: Nuclear emulsion

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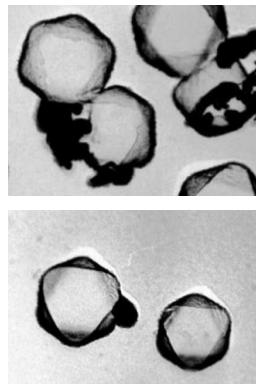
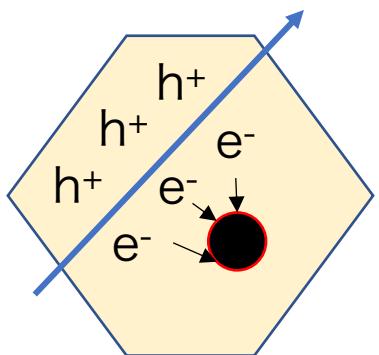
E07 type emulsion



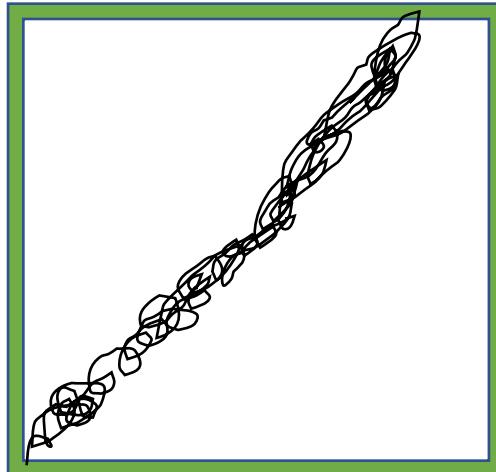
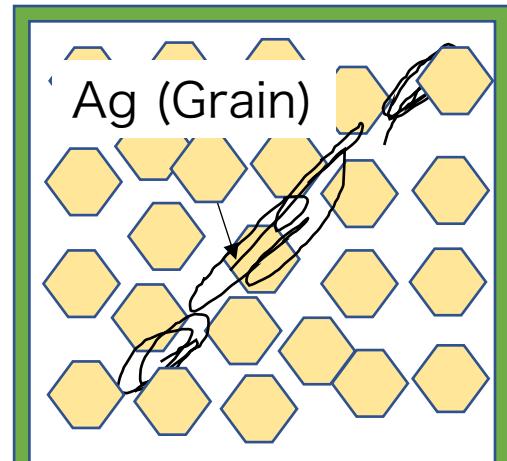
(35 cm × 35 cm × 0.6 mm)



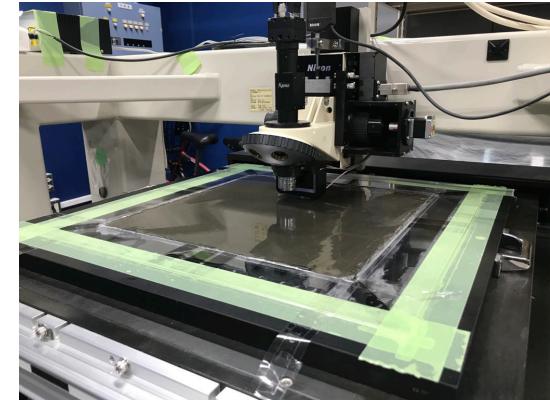
AgBr Crystal
diameter = 200 nm



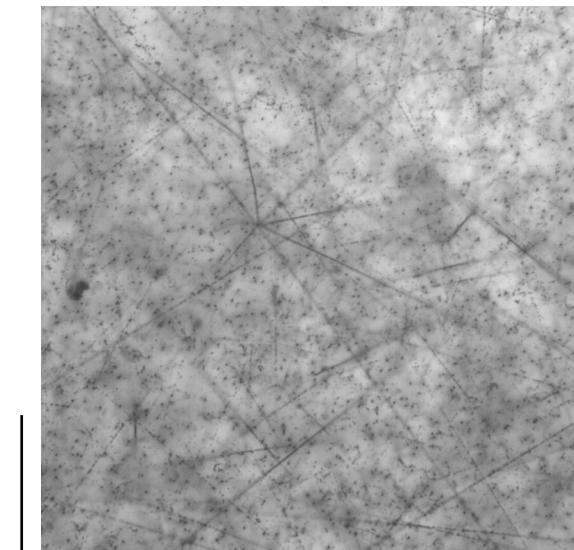
Semi-conductor
with 2.5 eV bandgap



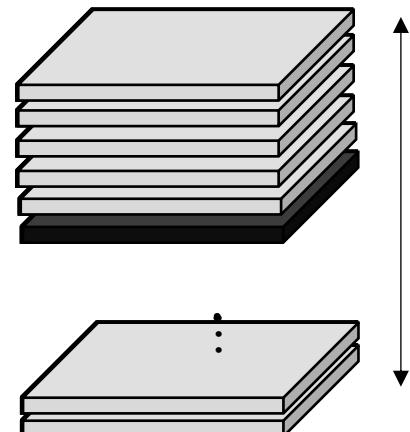
Scanning system



CMOS camera + LED light



100 μ m

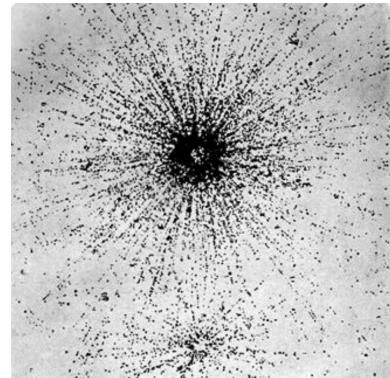


Spatial resolution: sub- μ m

Pioneering observations with Nuclear emulsion

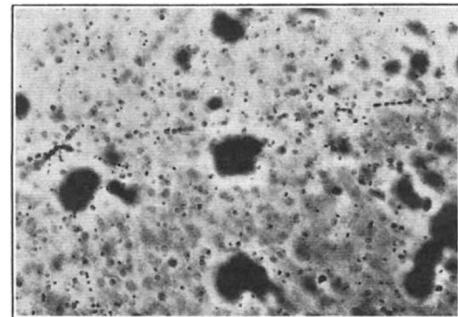
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α -particles
(1915 S. Kinoshita et.al)



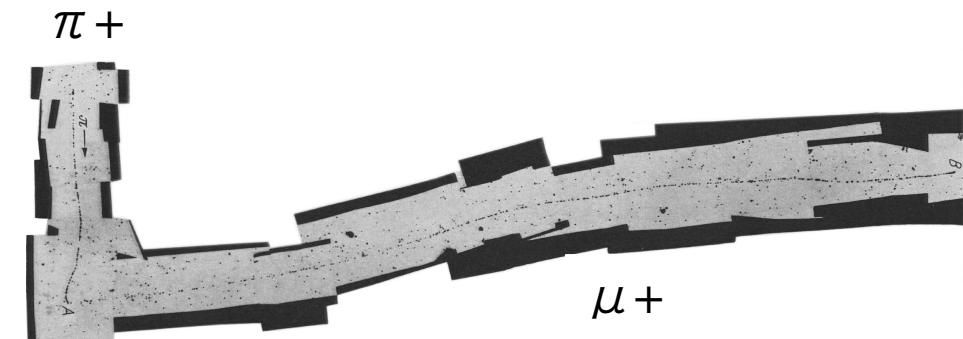
Philosophical Magazine and Journal of
Science Ser. 6, 29, 171, 420-425 (1915)

Cosmic-ray Interactions
(1937 M. Blau et al.)



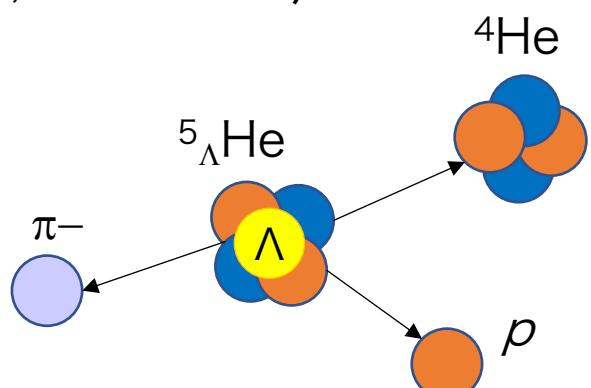
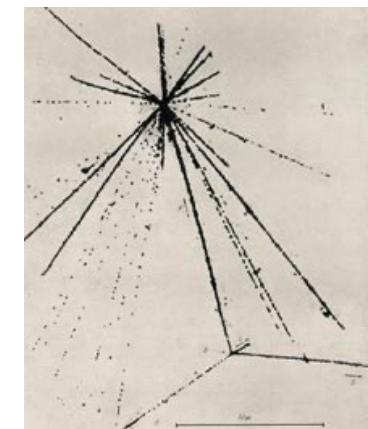
Nature 140, 585 (1937)

Meson particle ($\pi^+ \rightarrow \mu^+ + \nu_\mu$)
(1947 C. F. Powell et.al)



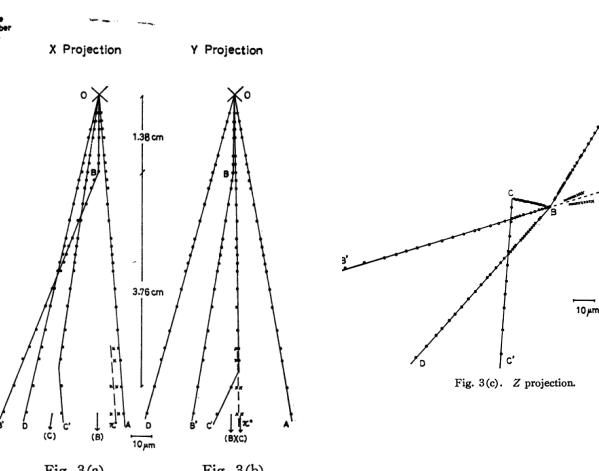
Nature 160, 453 (1947)

Hypernuclear weak decay
(1954 M. Danysz, J. Pniewski)



Phil. Mag. 44, 348 (1953)

Chramed particle (1971 Niu et.al)
 $X(\Lambda_c^+) \rightarrow \pi^0 + \rho$ or $X(D^\pm) \rightarrow \pi^0 + \pi^\pm$



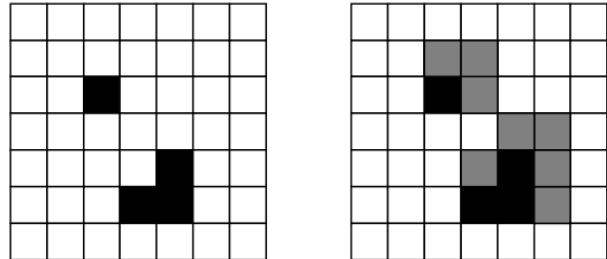
Prog. Theor .Phys., 46, 5 (1971)

Manual search with microscopes
 ~ 100 people ?
→ Automation was mandatory

Track Selector Nagoya Univ. (F-Lab)

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1. Clusterizing

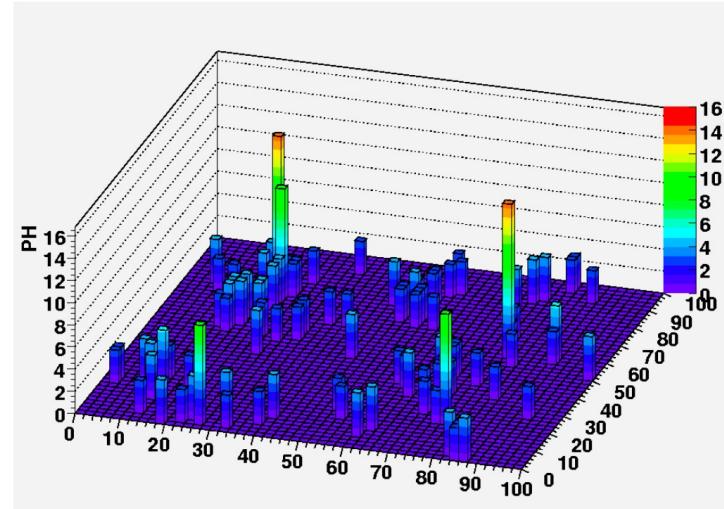


(a) 1x1

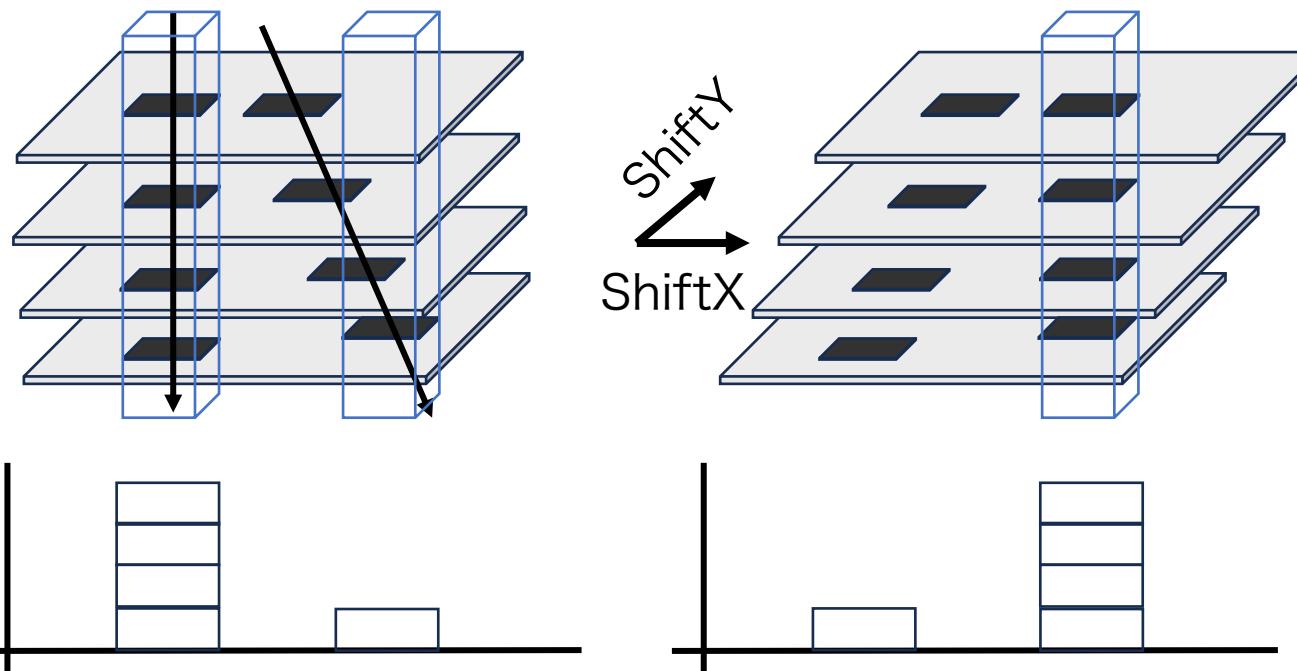
(b) 2x2

(c) 3x3

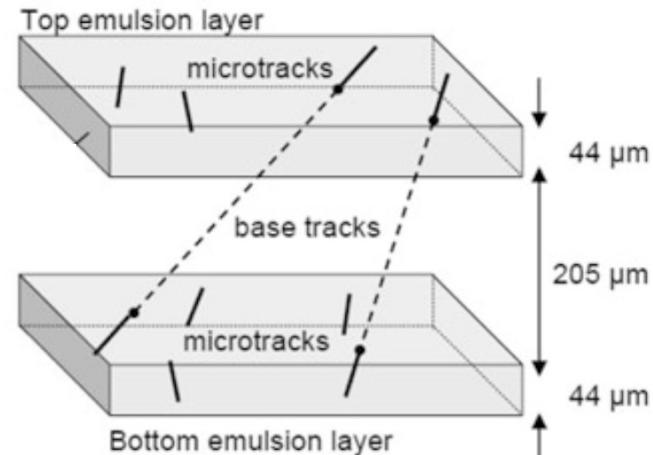
~1200 such procedures $|\tan \theta| < 0.6$

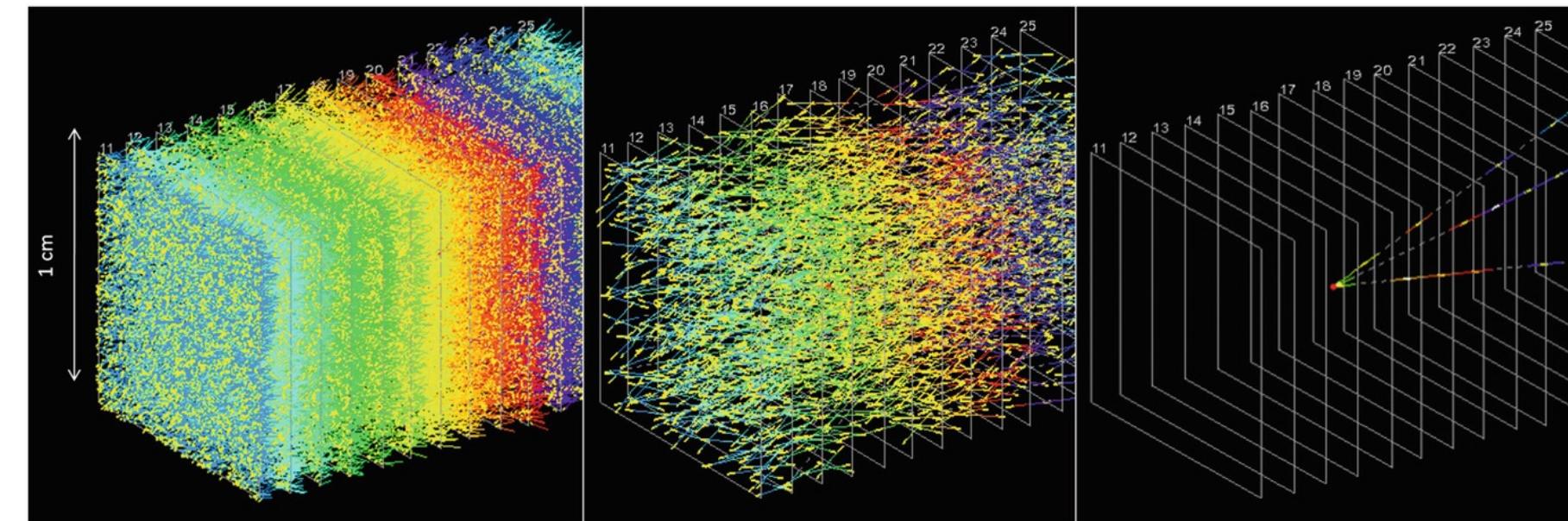


2. Reconstructing tracks in emulsion layers (Microtracks)

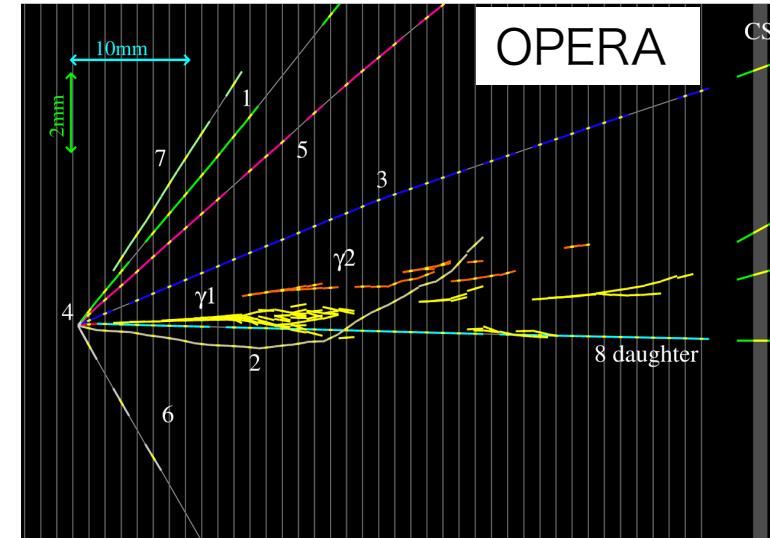
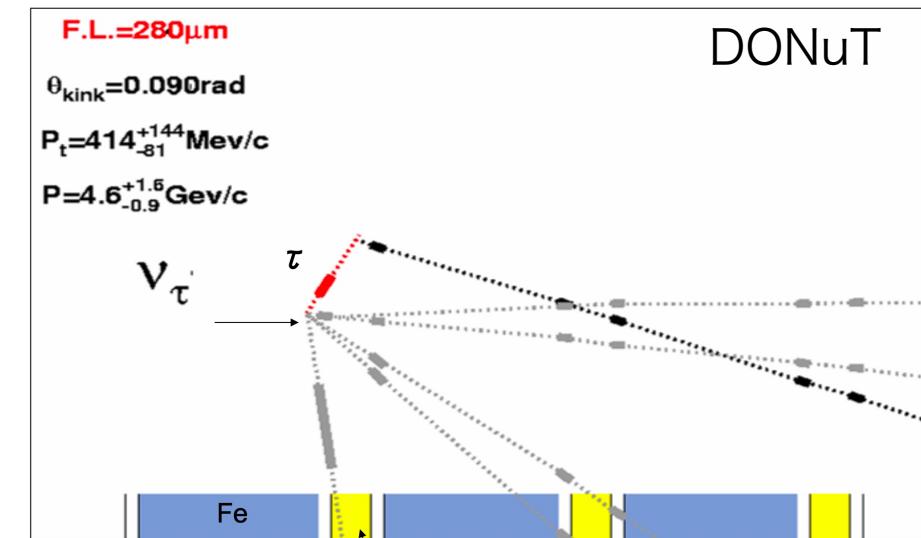


3. Reconstructing tracks in base (Base tracks)





Particle Physics Reference Library pp 383–438



Connecting tracks in several tenth sheets

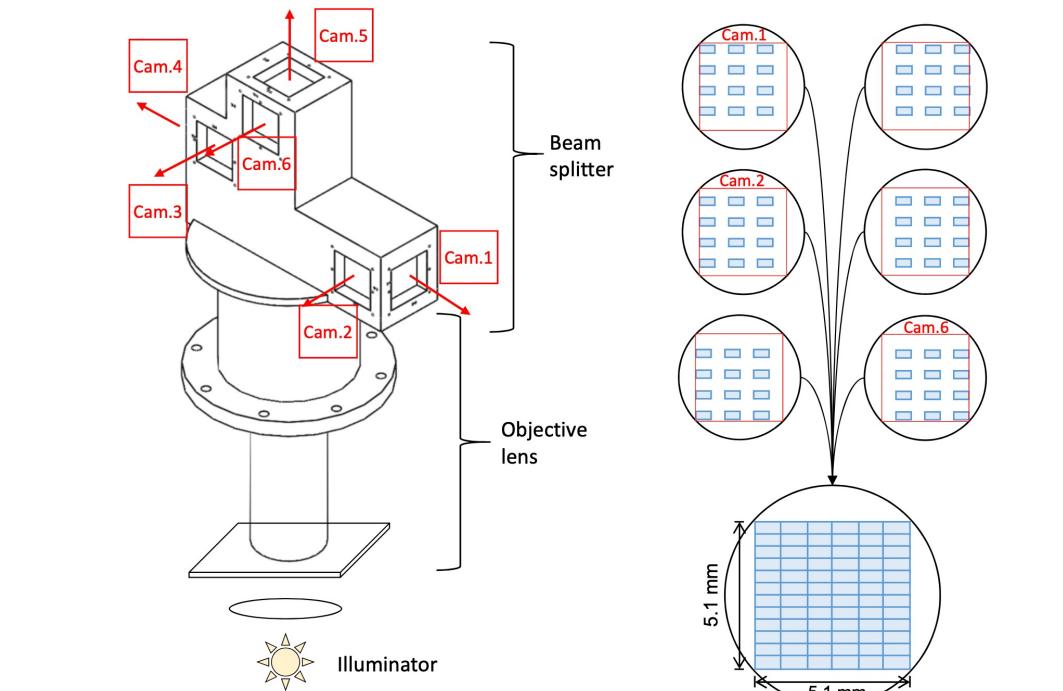
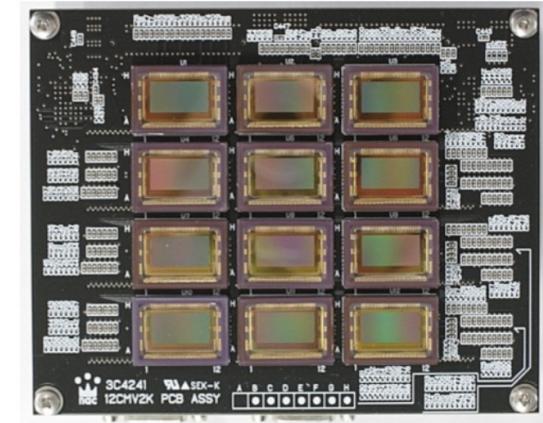
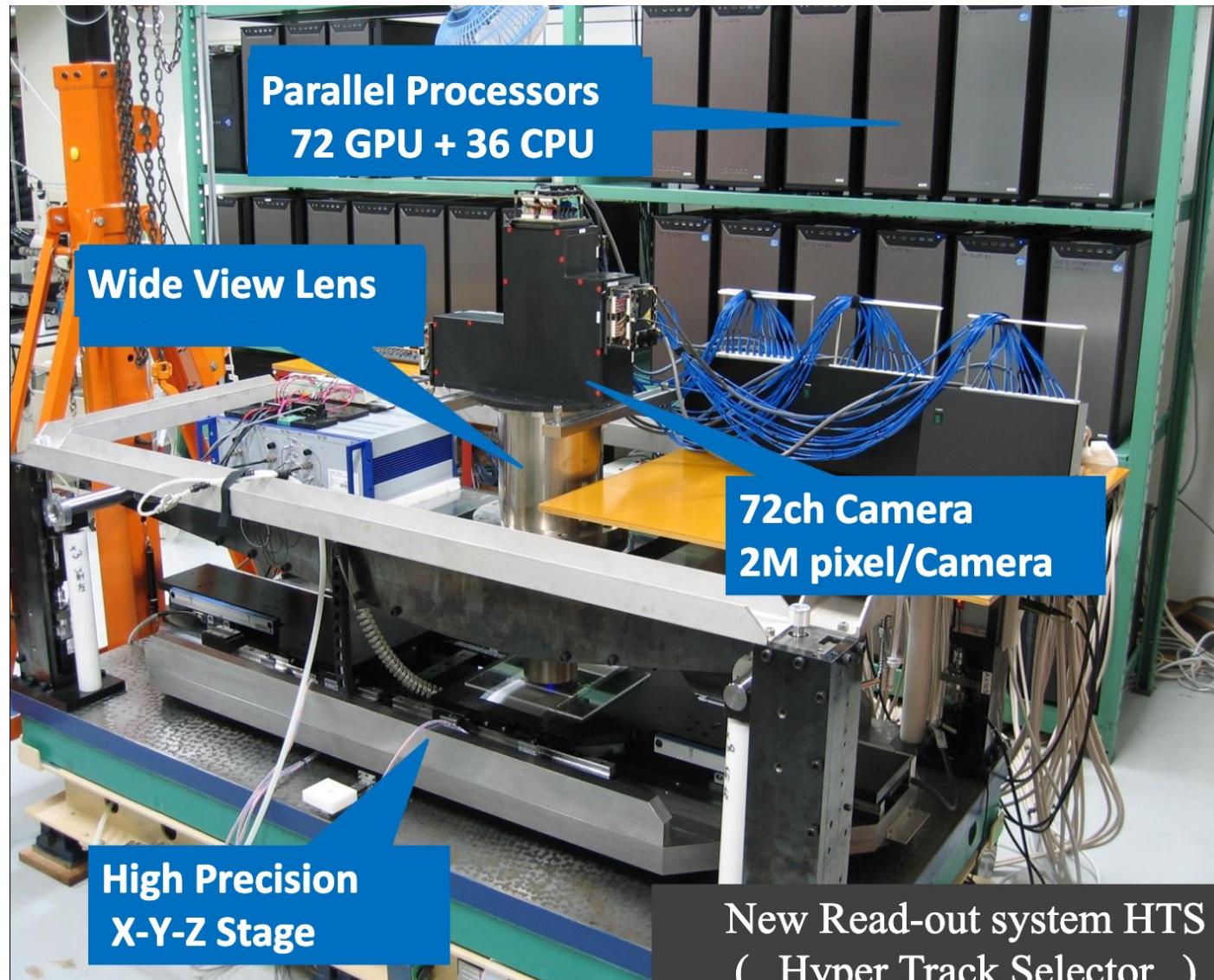
- Remove short tracks
- Remove penetrating tracks
- Search vertexies

DONuT
 $9 \nu_\tau$ events/

OPERA
5 events of ν_τ
in $2 \times 10^{20} \nu_\mu$
 ν oscillation

Hyper Track Selector

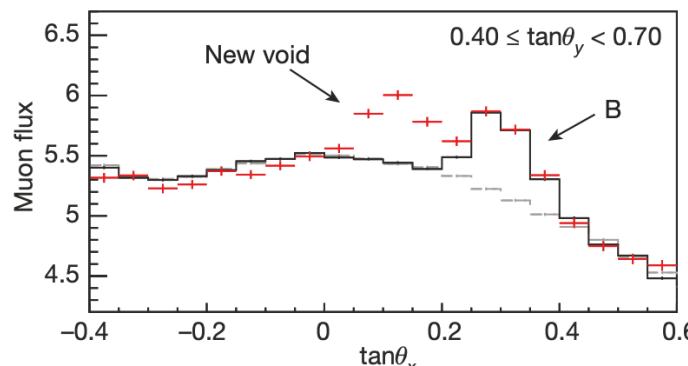
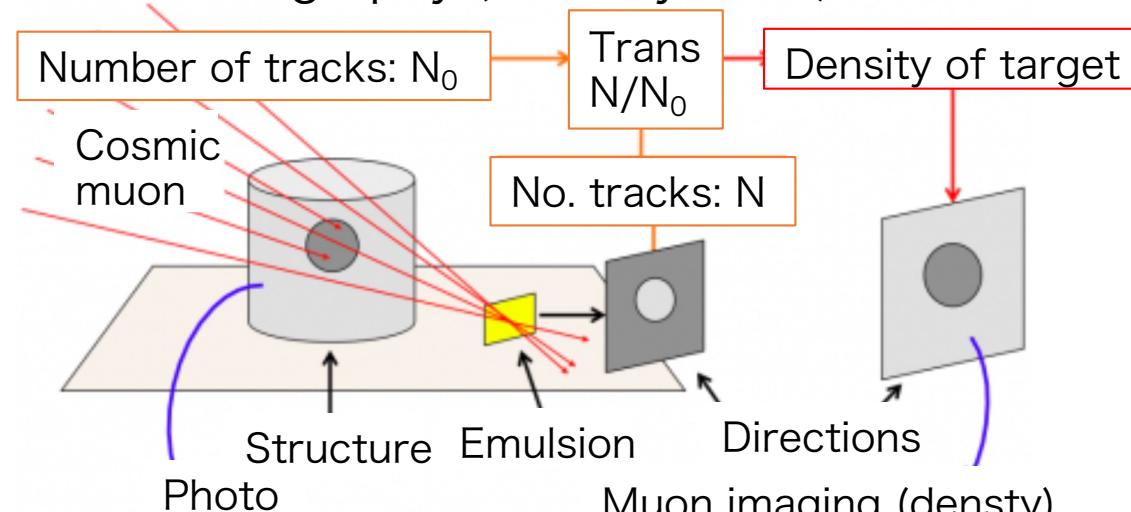
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New application with Hyper Track Selector

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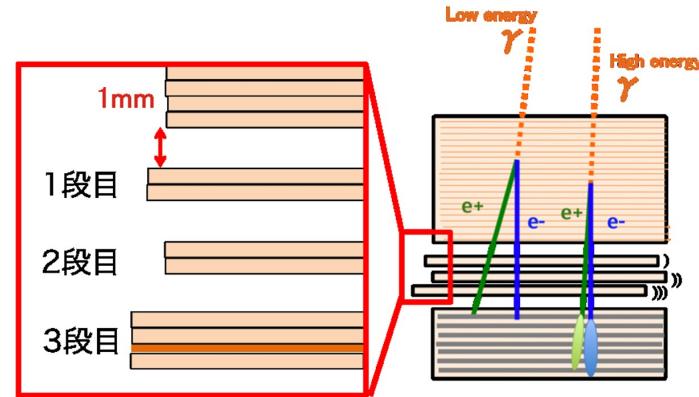
Muon radiography (Scan Pyramid)



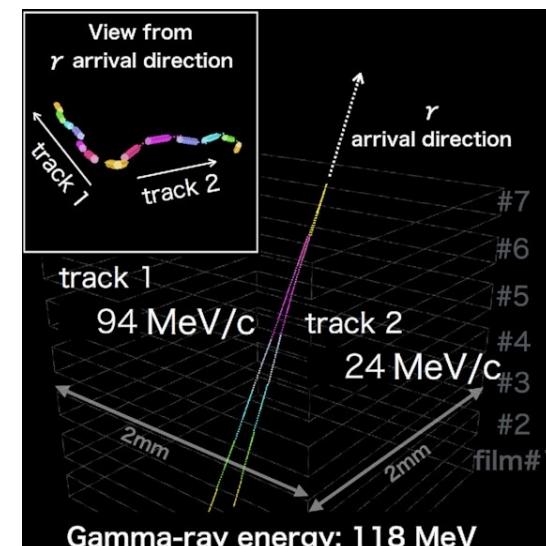
GRAINE (Gamma- Ray Astro- Imager with Nuclear Emulsion)



balloon



Emulsion + time shifter



~10x better resolution
than Fermi LAT
to be achieved

https://web-japan.org/kidsweb/hitech/17/pyramids_en.html

<https://flab.phys.nagoya-u.ac.jp/2011/appli/muon/>

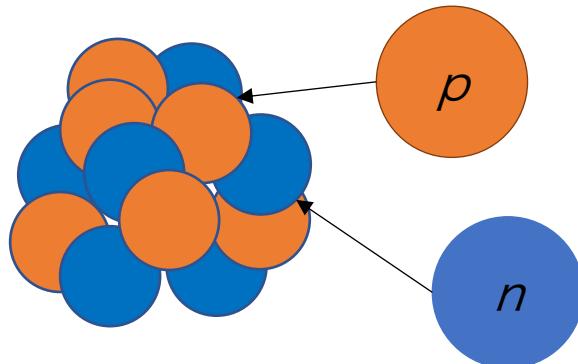
<https://flab.phys.nagoya-u.ac.jp/2011/appli/graine/>

PTEP 2021,12, December 2021, 123H02

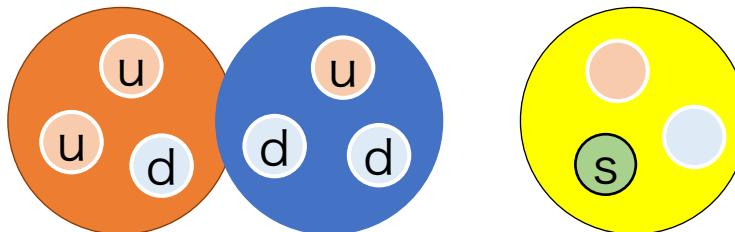
Automatic track following for Hypernuclear detection

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Bayon-Bayon interactions



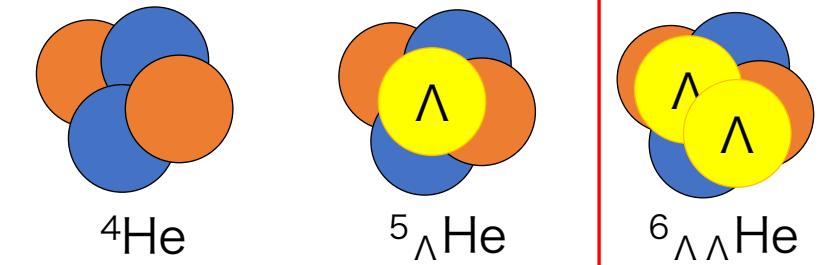
Short-range
quark contribution?



Hyperon
 Λ (uds)

$\tau \doteq 262$ ps
▲ Beam, target

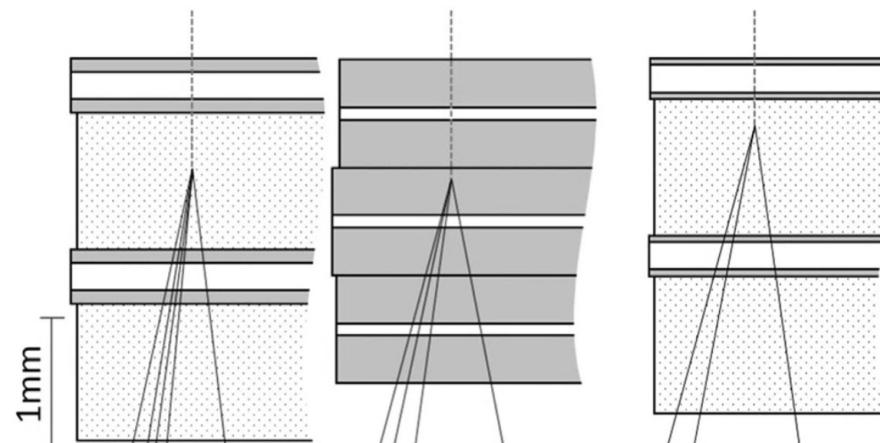
Hypernuclei:
Bound state of nuclei and hyperons



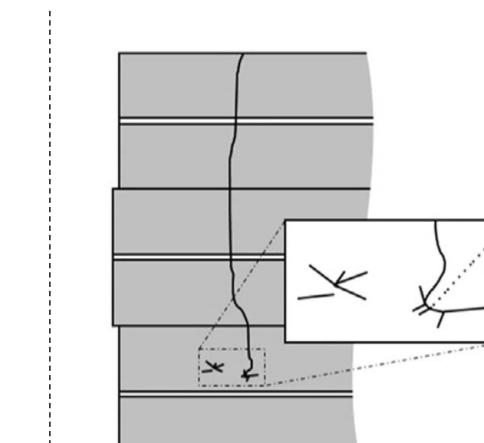
γ - N , γ - γ interactions via
binding energy measurements

Detector configurations

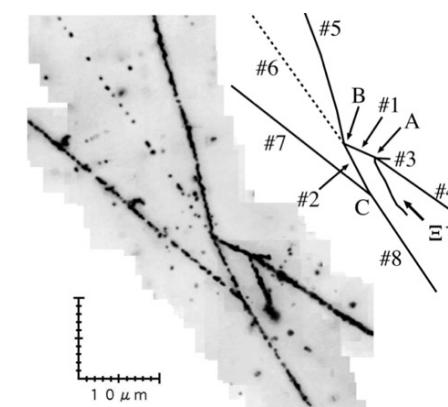
$\langle E_\nu \rangle 17 \sim 100$ GeV



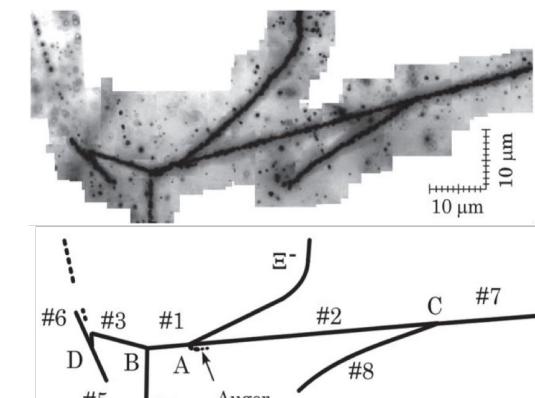
$\langle E_\Xi \rangle \sim 0.15$ GeV



Double strangeness production
 $\Xi^- + p \rightarrow \Lambda + \Lambda$



NAGARA



KISO

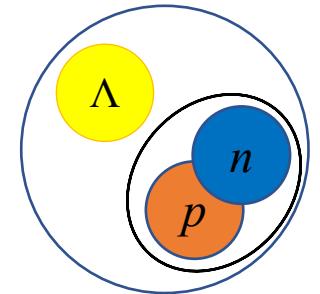
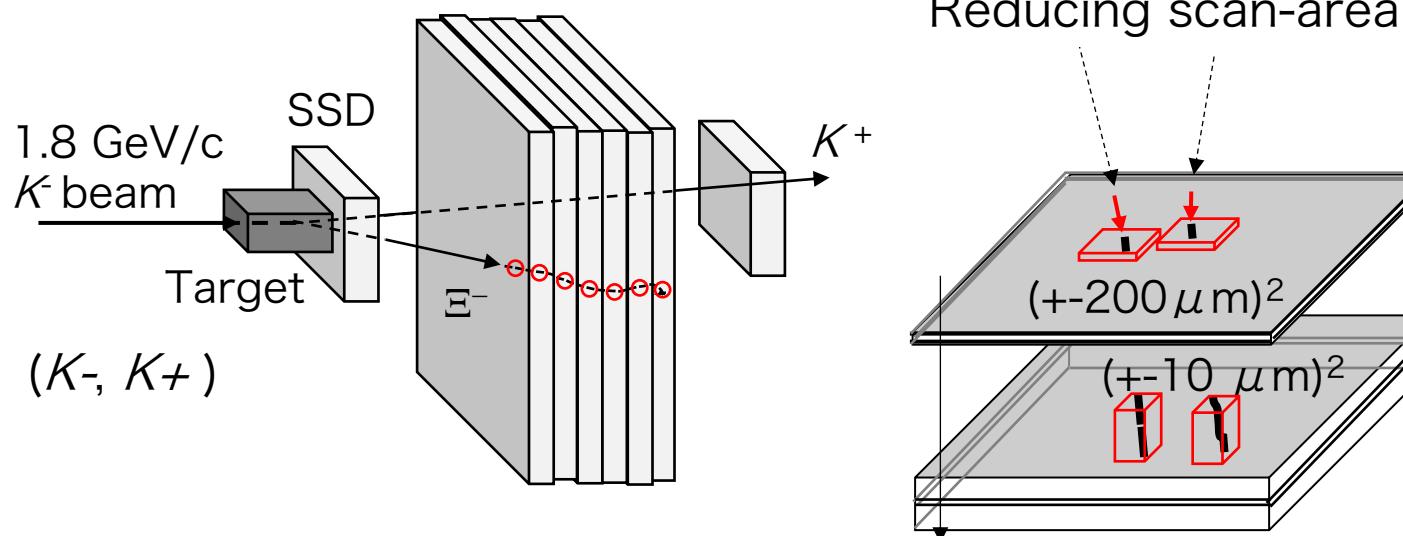
■ Metal plate ■ Emulsion layer

□ Base film

Hypernuclear detection

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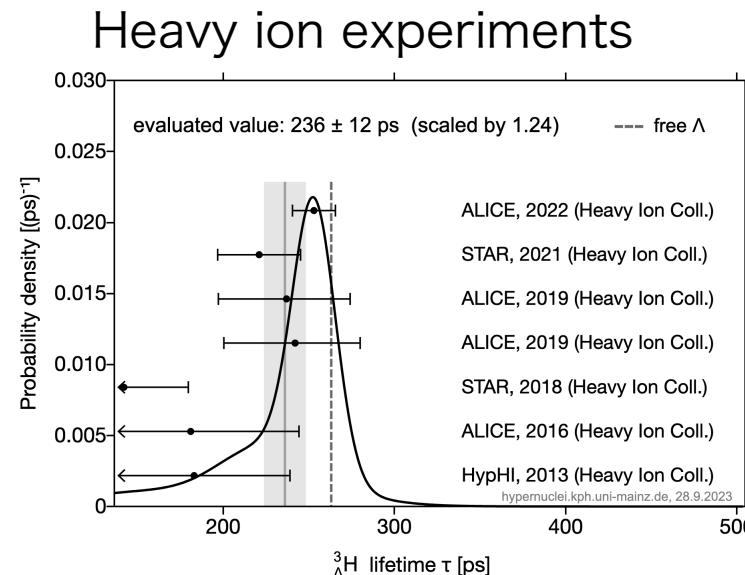
J-PARC E07: Search for double-strangeness hypernuclei



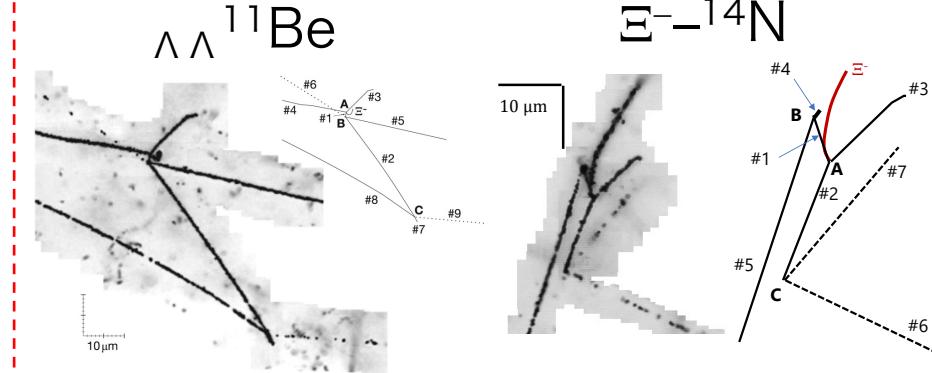
${}^3\Lambda\text{H}$: Hypertriton
Lightest &
Simplest

Binding energy (Λ -d)
 $B_\Lambda = 130 \pm 50 \text{ keV}$ (1973)

cf.) ${}^4\Lambda\text{H} \sim 2000 \text{ keV}$
 $\tau({}^3\Lambda\text{H}) \doteq 262 \text{ ps} ??$



Cand. of double-strangeness: 33



H. Ekawa et al., PTEP, (2019)
A.N.L. Nyaw et al., BSPIJ, (2020)
S. H. Hayakawa et al., PRL, (2021)
M. Yoshimoto et al., PTEP, (2021)

Short lifetime? How much bounding?

New experiments

For lifetime

GSI, RHIC, LHC, J-PARC, ELPH...

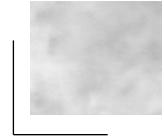
Binding energy
RHIC, LHC, MAMI-C, J-LAB, Emulsion

<https://hypernuclei.kph.uni-mainz.de/>

Overall scanning

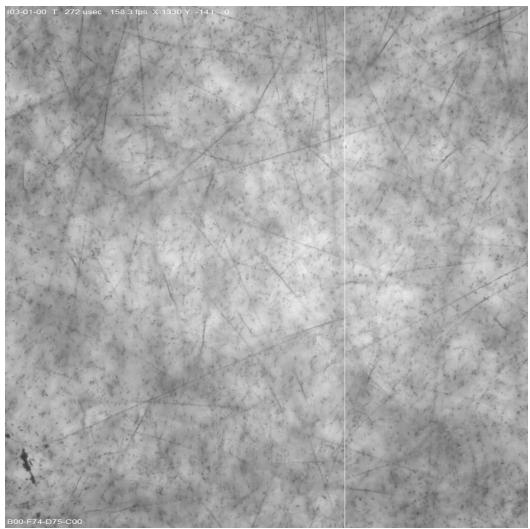
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Direct detection of hypernuclei

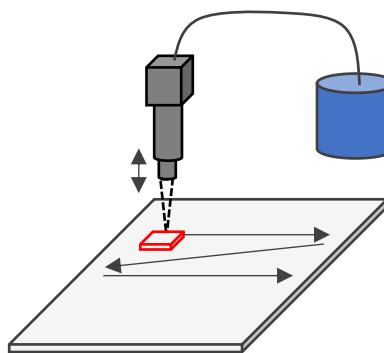


100 μm

Area: x18
Speed of Z:
x2

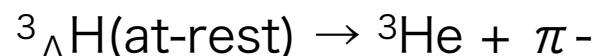
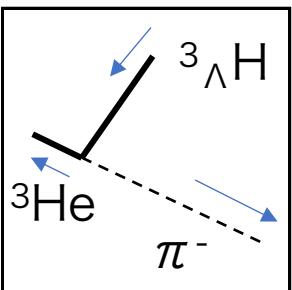


100 μm

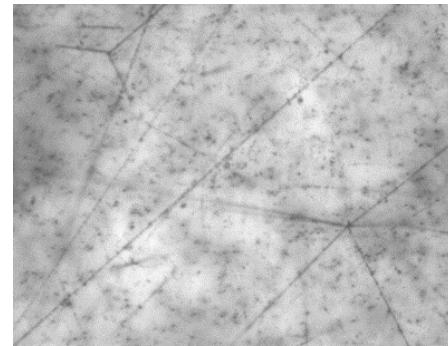


- 1300 emulsion sheets (E07)
- Independent from trigger condition

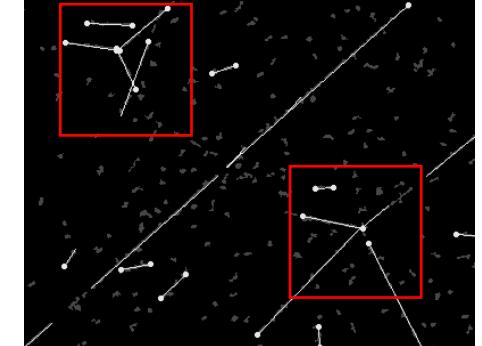
Double-strangeness: 10^3
Single- Λ : Several million



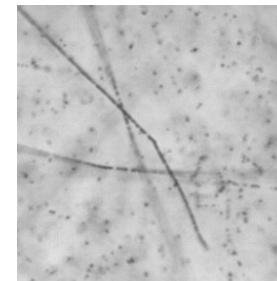
Vertex picker: Line-detection



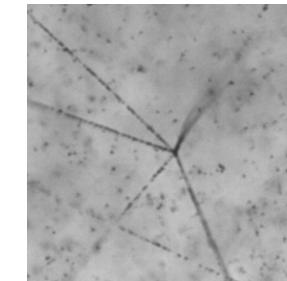
J. Yoshida, et al., N.I.M A, 847 (2017) 86-92



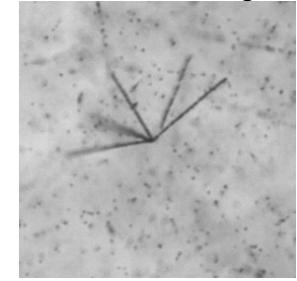
Background
Cross



Interaction

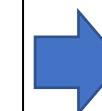


α -decay



Natural RI
Th Series
We needed
Breakthrough

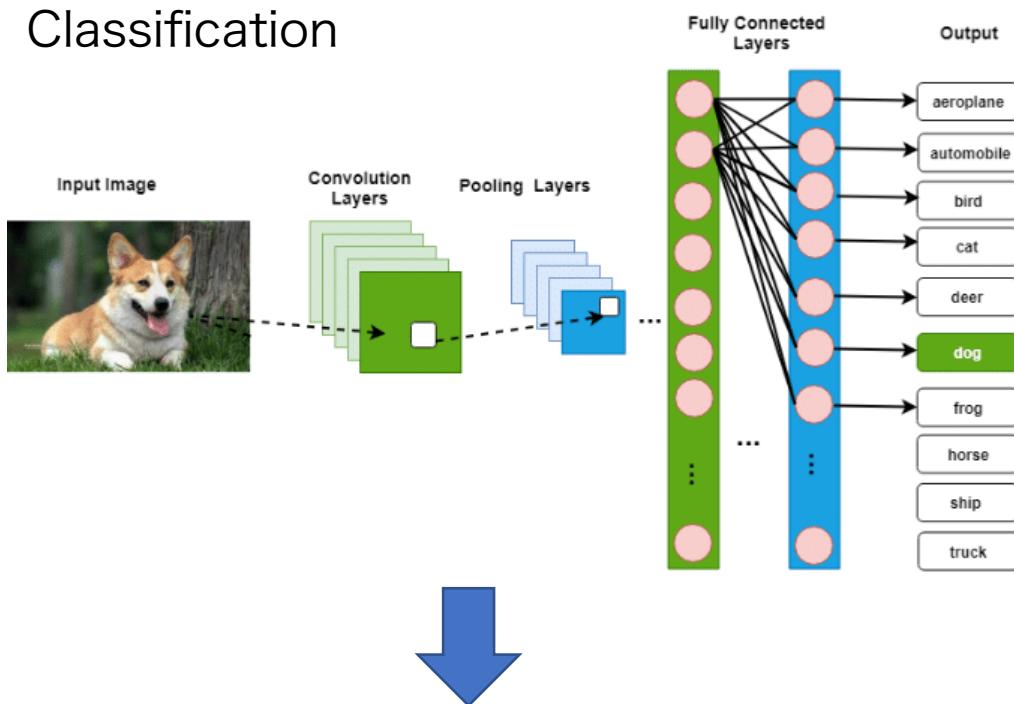
Data size: 140 PB
No. event: 10^9
Inspection: 560 years



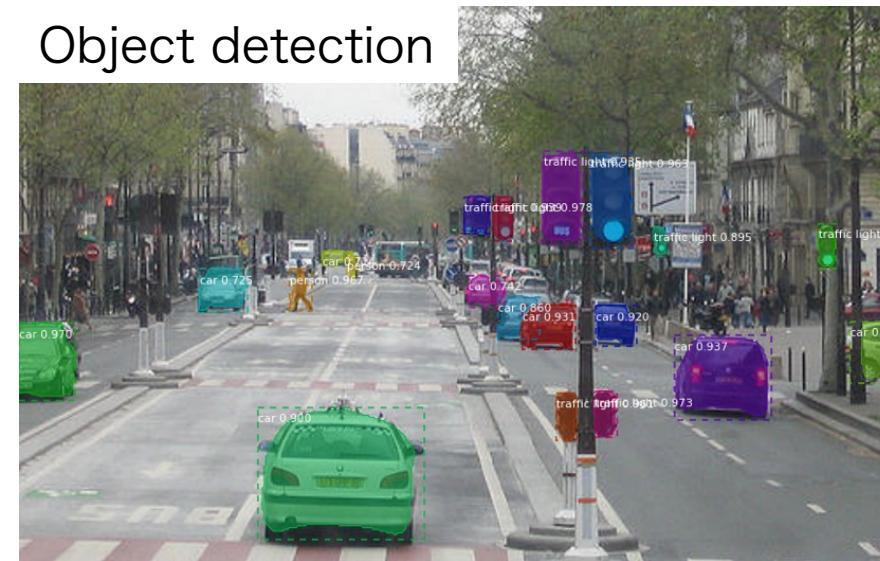
Machine-learning

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Classification



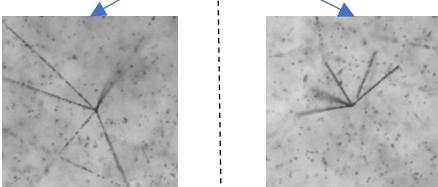
Object detection



Auto pilot
Auto Payment
Security camera
...

Applications

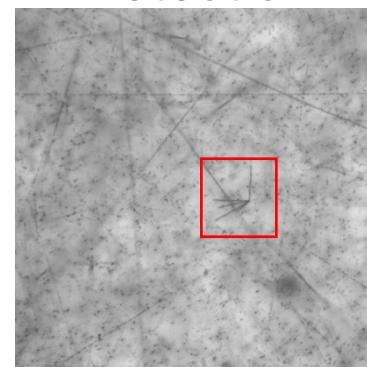
Classification



A

B

Detection



Training data: 10k~ images
→ For rare events

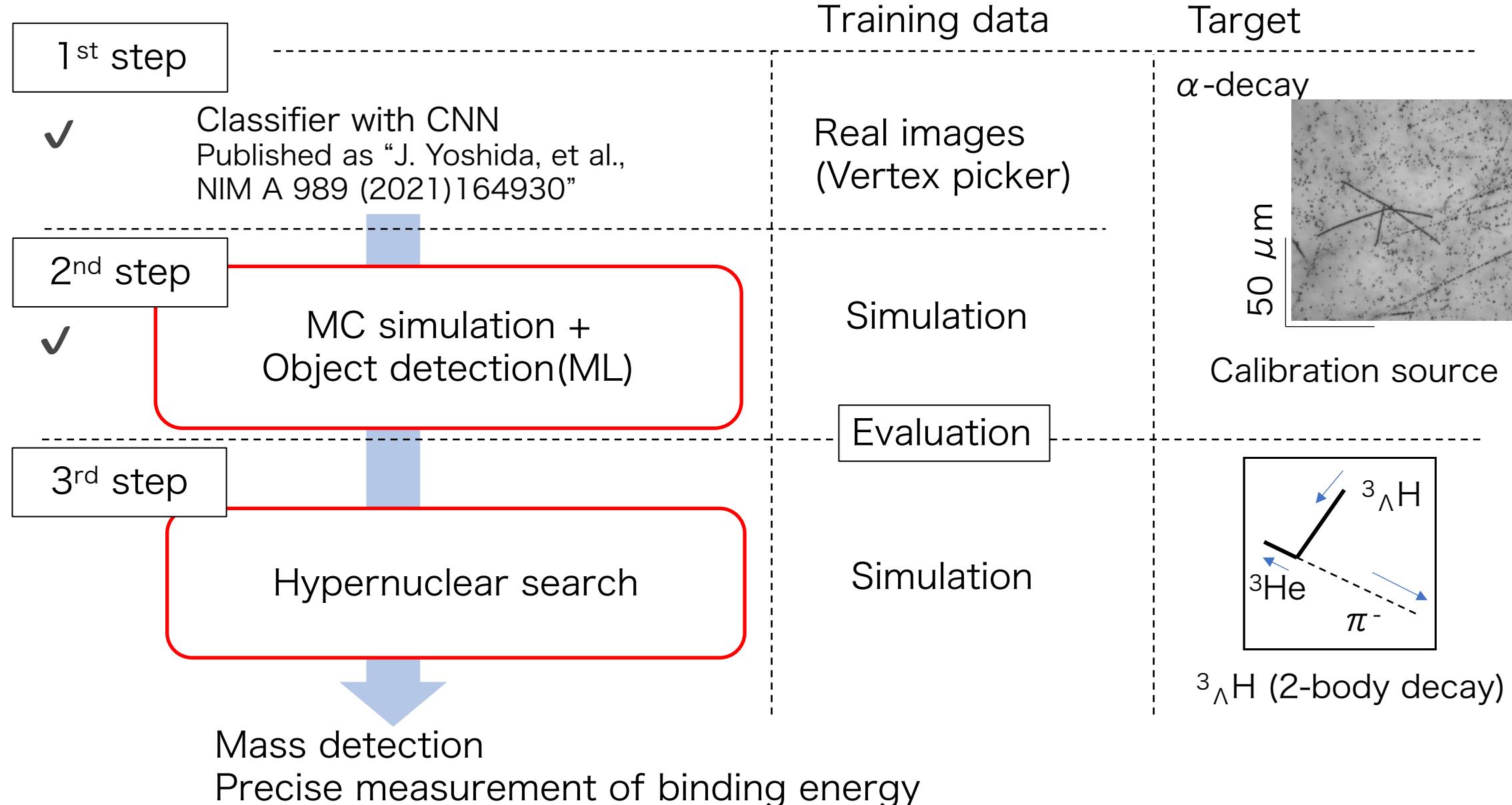
ML + Monte Carlo simulation

<https://transcranial.github.io/keras-js/#/mnist-cnn>
<http://bdm.change-ip.com/?p=3983>

A. Radovic et.al, Nature 560, 41–48 (2018)

Strategy of developments

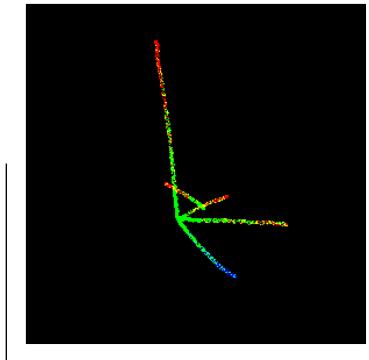
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Training data

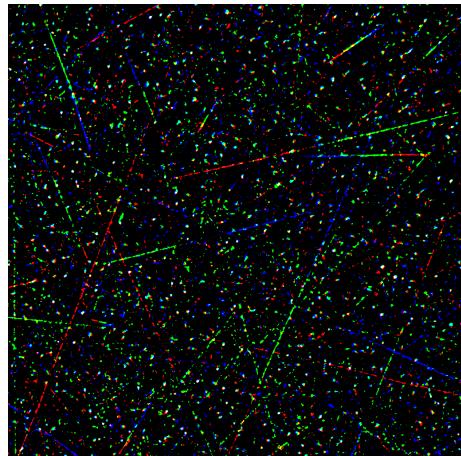
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α -decay event
(Color = depth)



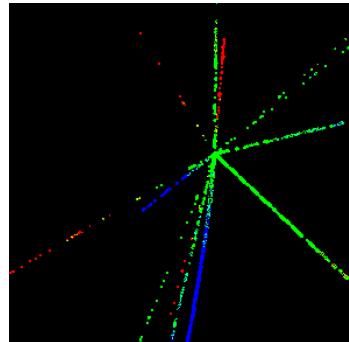
50 μm

Background
(From Real images)

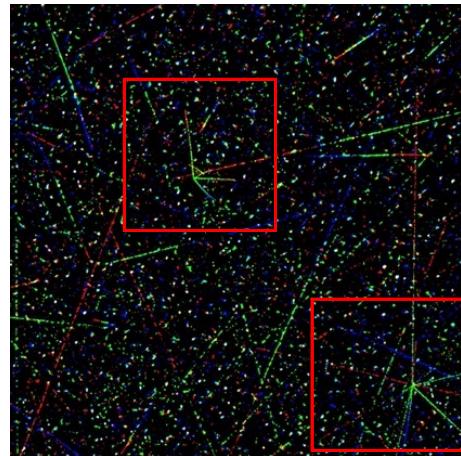


50 μm

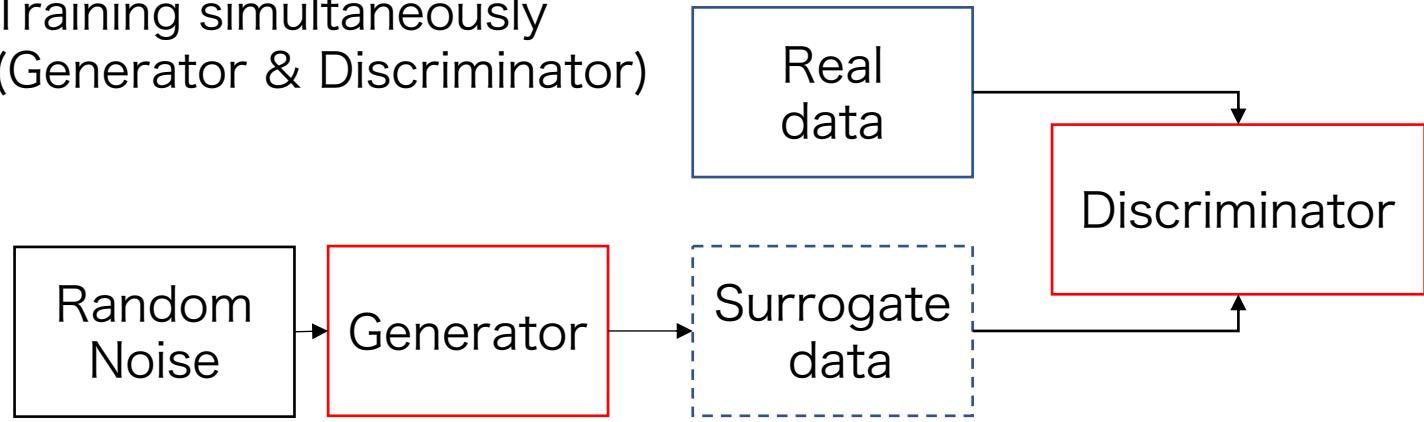
Beam interaction
(Negative sample)



Mix

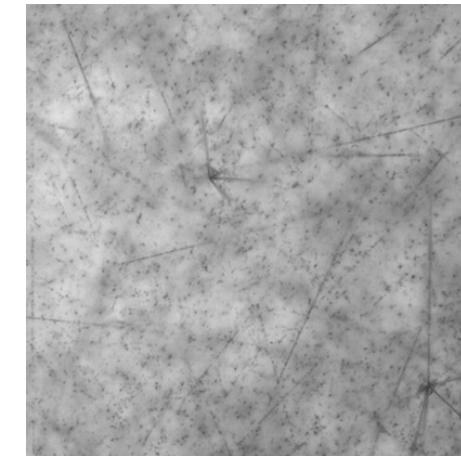


Generative Adversarial Networks (GAN)
Training simultaneously
(Generator & Discriminator)



Pix2pix: Image-style transform

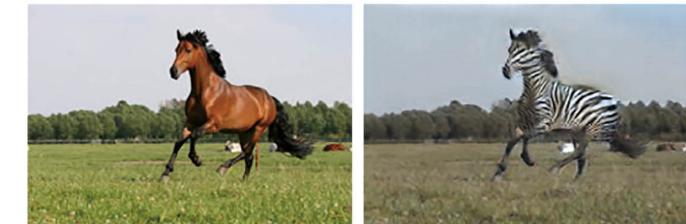
<https://arxiv.org/abs/1611.07004>



Simulated image



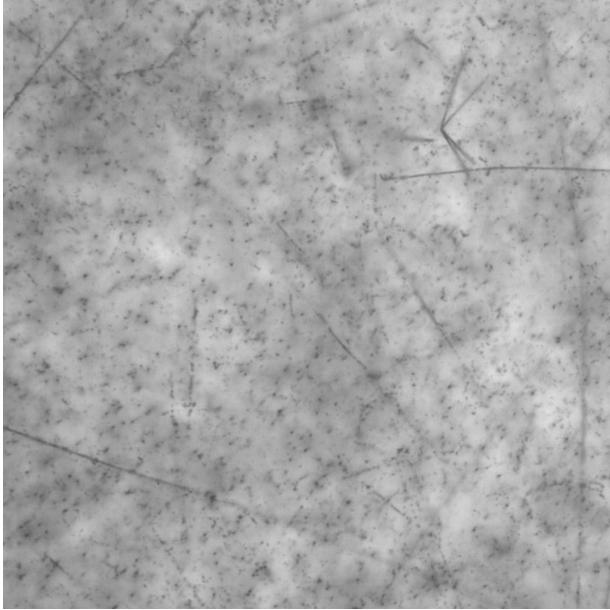
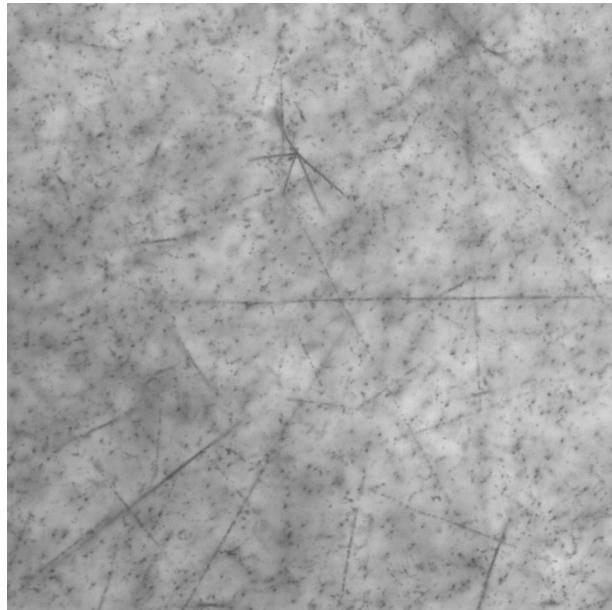
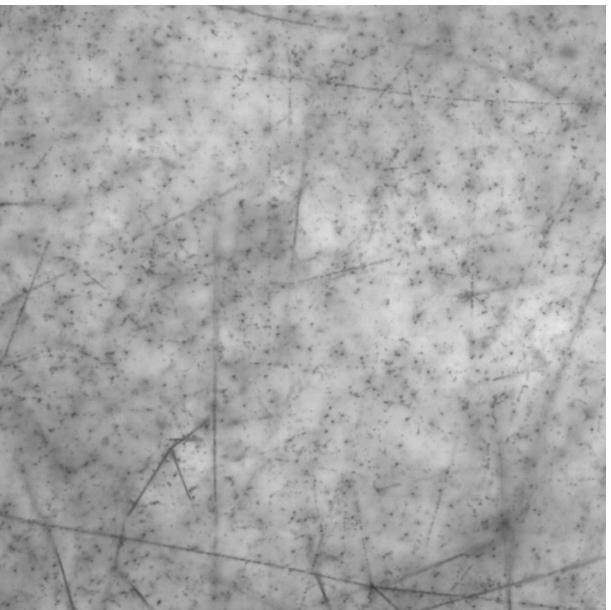
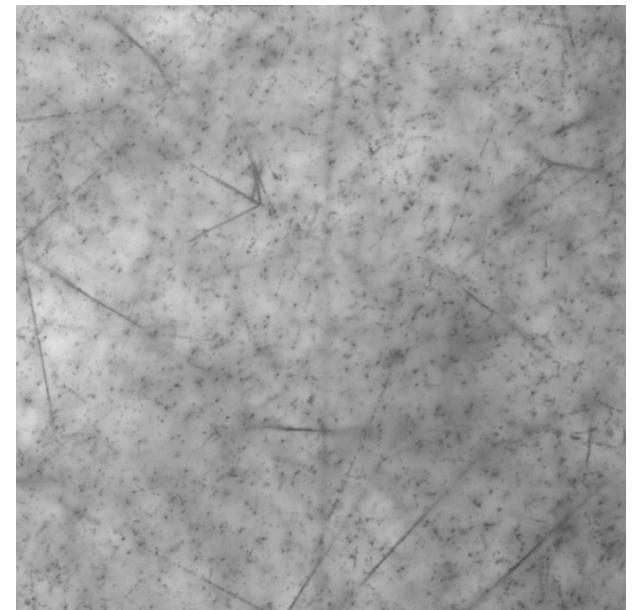
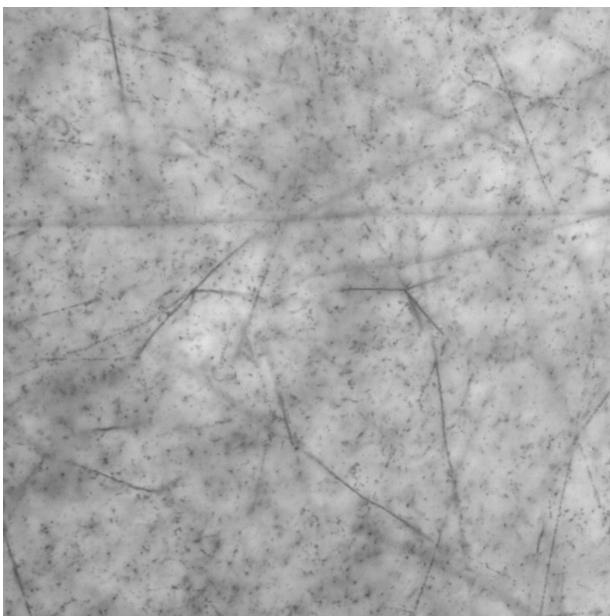
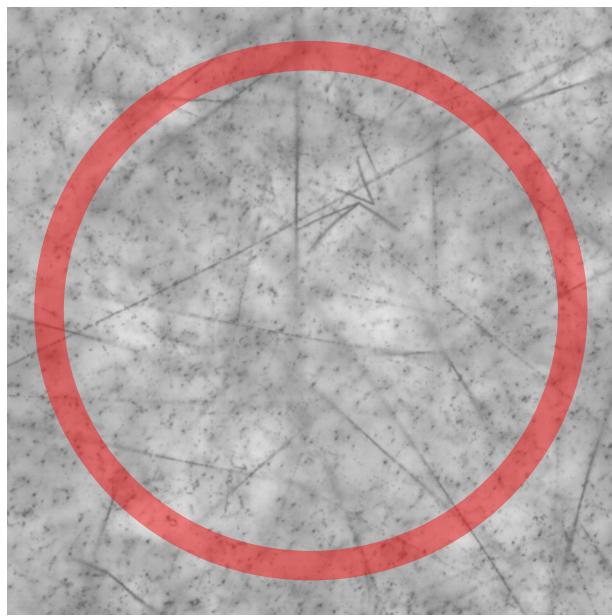
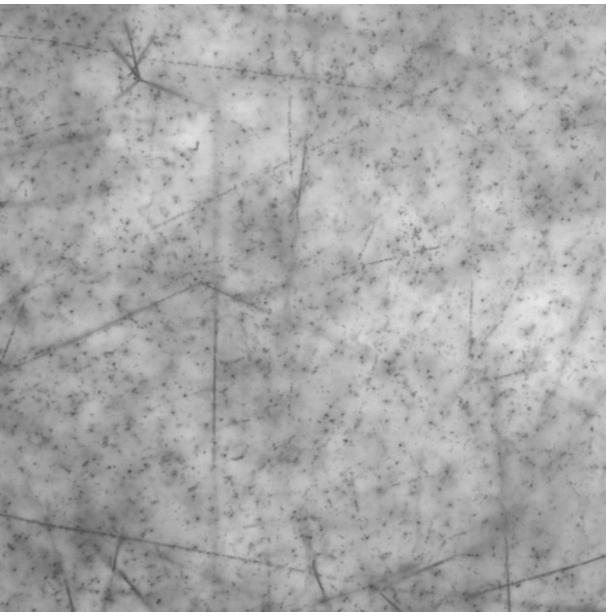
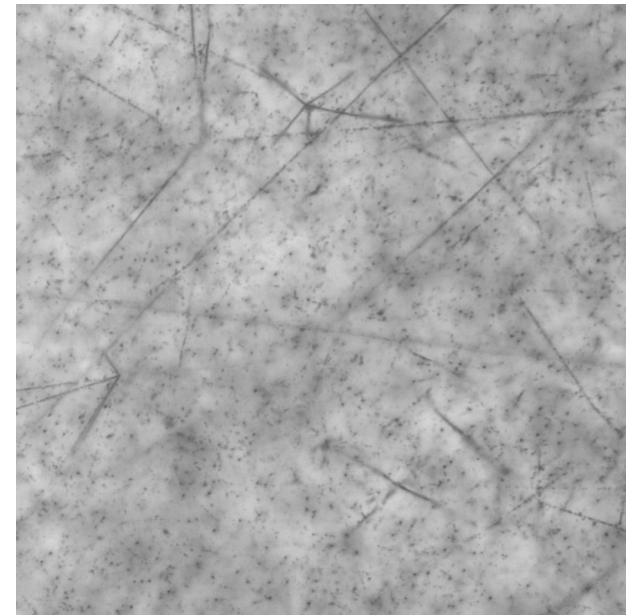
Zebra \rightarrow Horse



Horse \rightarrow Zebra

Which one is real?

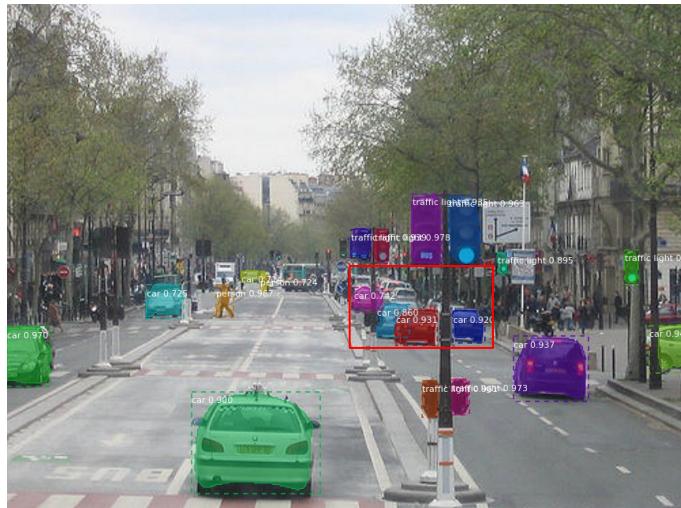
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Development of the model

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Mask R-CNN



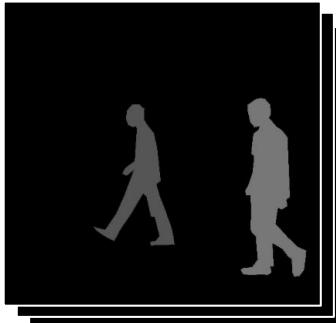
- Direct detection
- Classification: Score(0~1)
- Segmentation

Ex. training data

Image

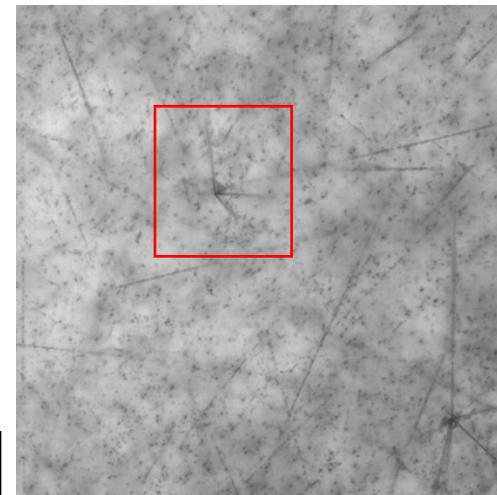


Mask



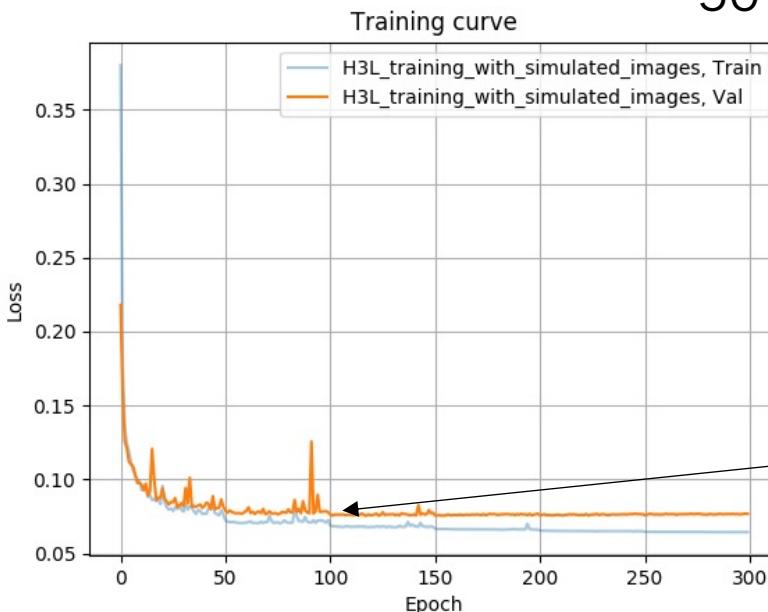
https://www.cis.upenn.edu/~jshi/ped_html/

Training data (Simulation)



50 μ m

Without annotation



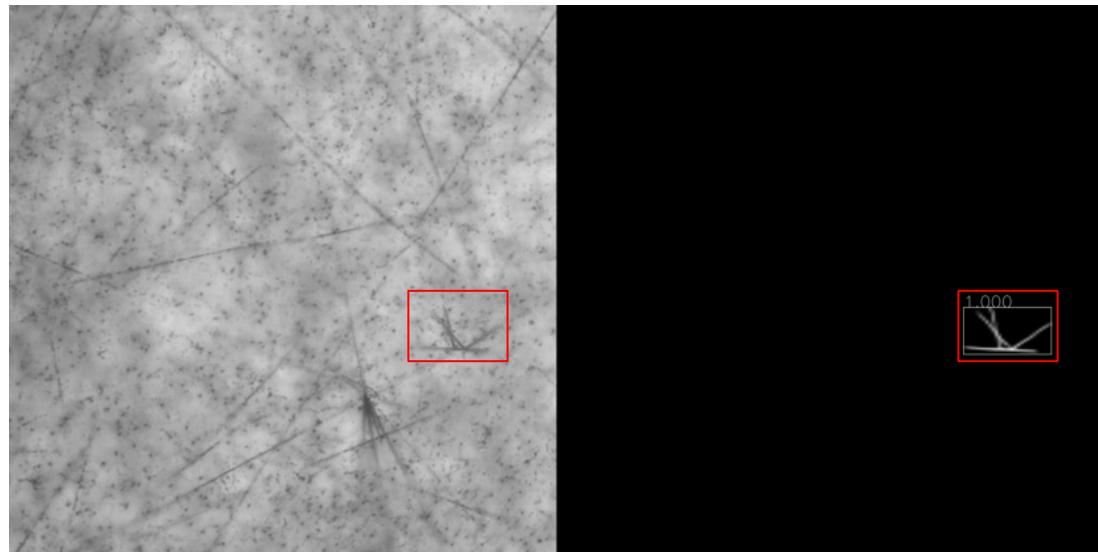
Pytorch tutorial (Resnet50)

- Training with 30k image pairs
- Training:Validation = 8:2
 - Iteration(Epoch) : 300,
(Updating params to reduce Loss)
 - Best epoch: 102
→ Test & Analysis

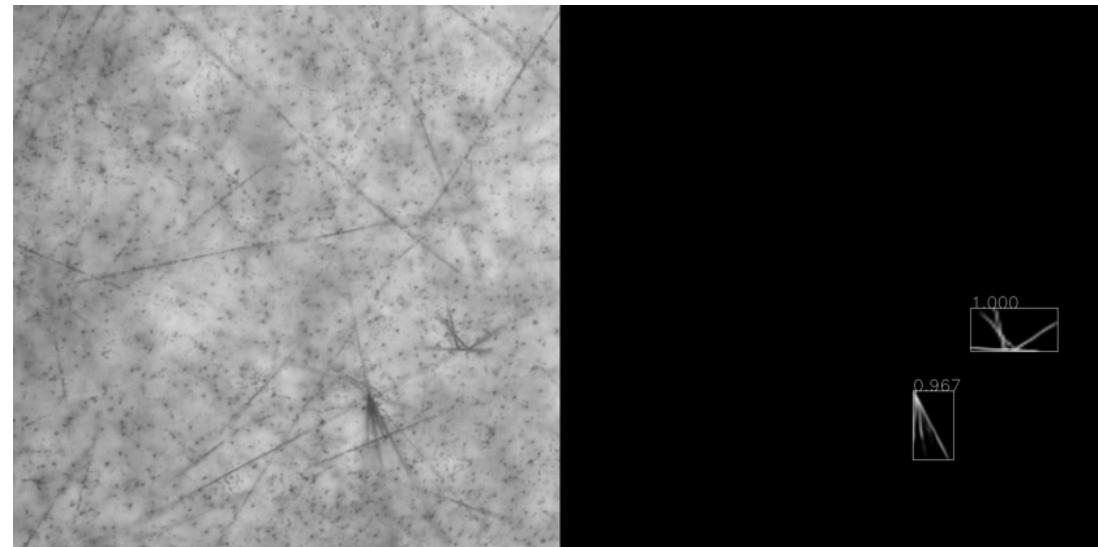
Evaluation with simulation data

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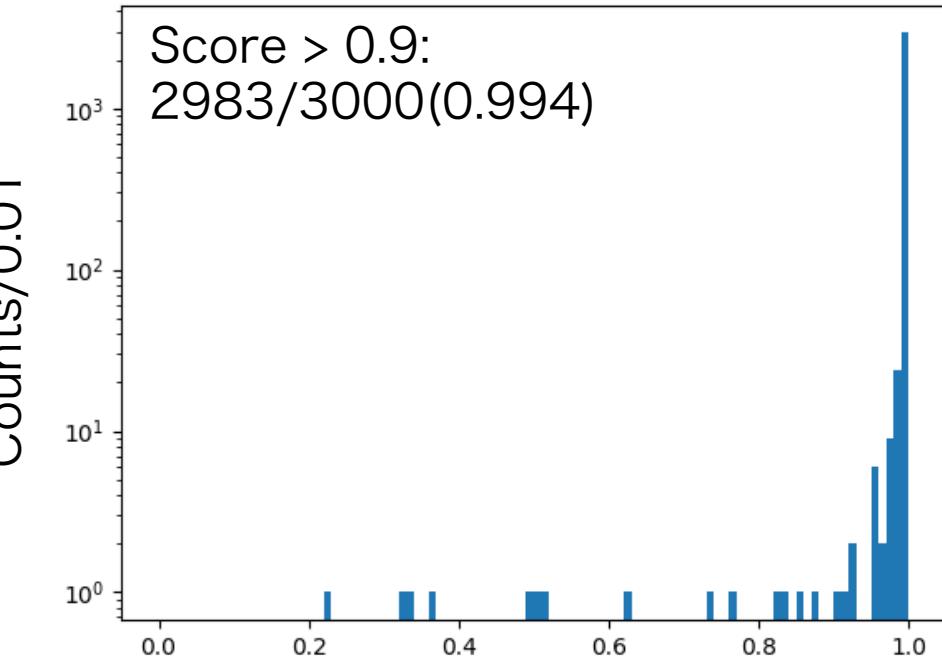
Results for simulated images



Trained without Negative sample



- Detect only α -decay event
- Segmentation



Score > 0.9: Efficiency 99%
Effectiveness Negative sample

Evaluation with real data

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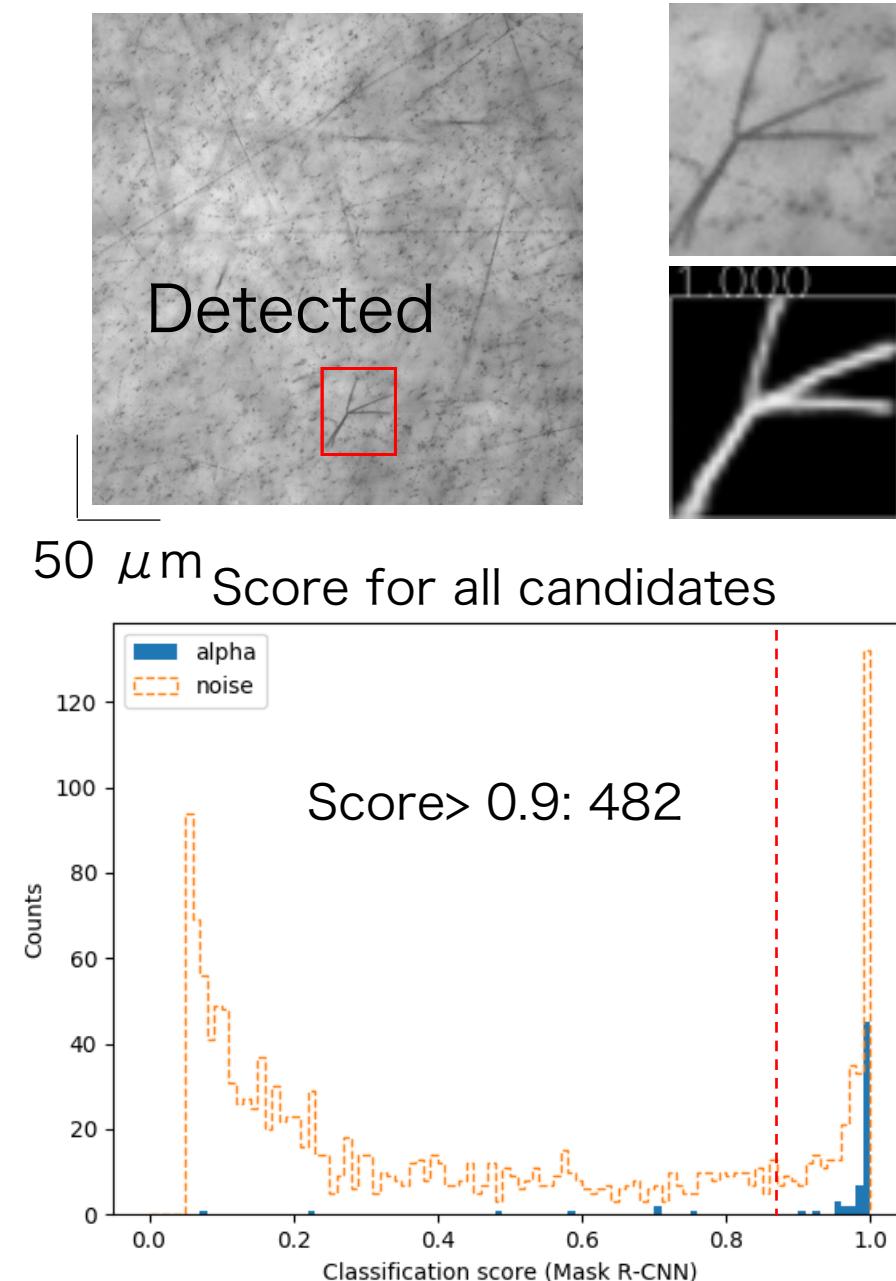
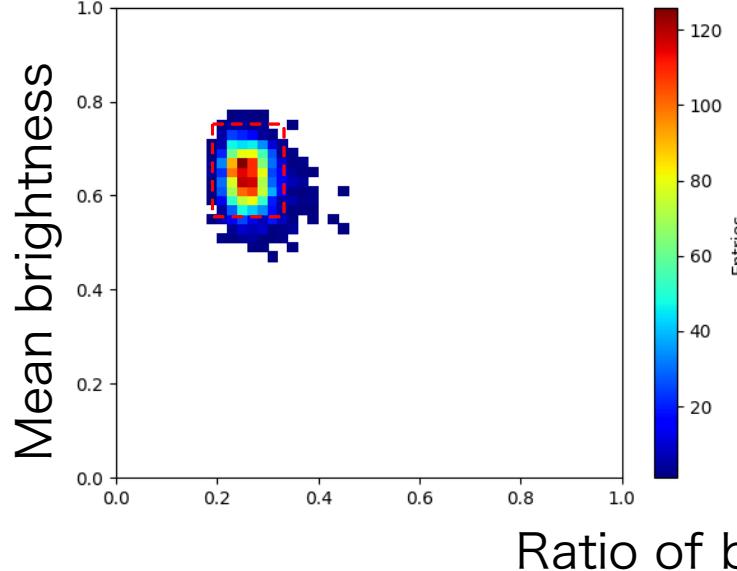
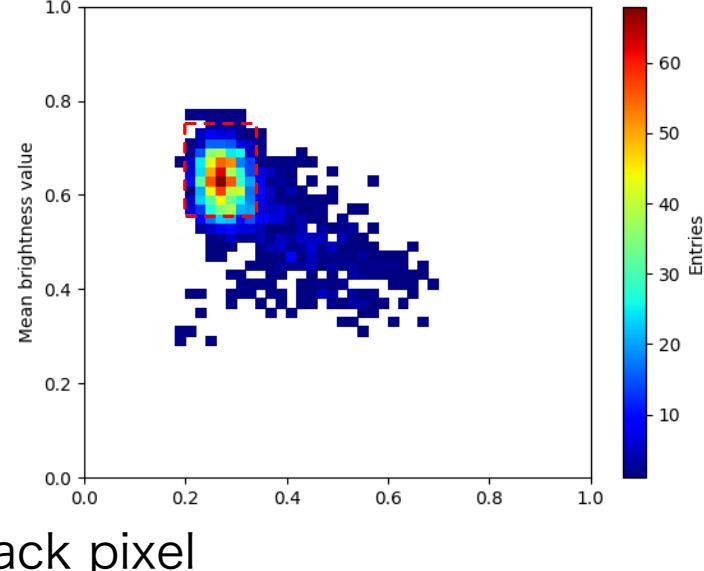


Image processing (with Mask Info.)

α -decay(simulated)



Candidates (Real)

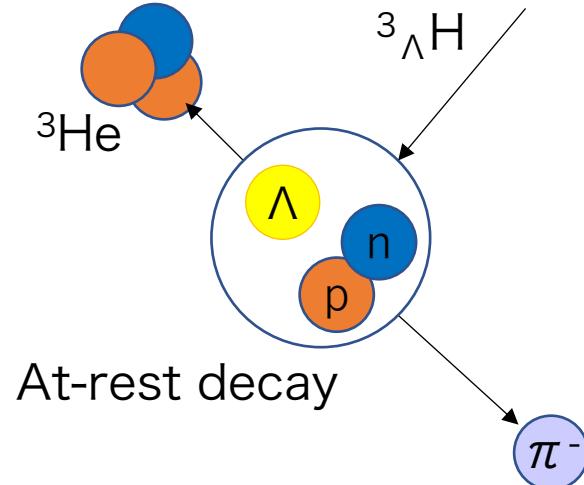


	Cand	Detected	Efficiency [%]	Purity [%]
VP	3105	31/76	$40.8^{+5.6}_{-5.5}$	~ 1.0
VP + CNN	1347	31/76	$40.8^{+5.6}_{-5.6}$	~ 2.3
Mask R-CNN	482	61/76	$80.3^{+4.2}_{-4.8}$	~ 12.6
+ Image pro	352	61/76	$80.3^{+4.2}_{-4.8}$	~ 17.3

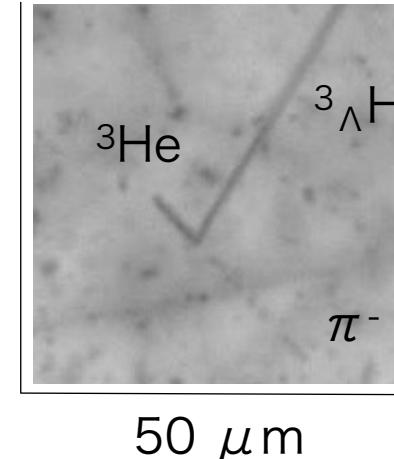
Hypertriton search

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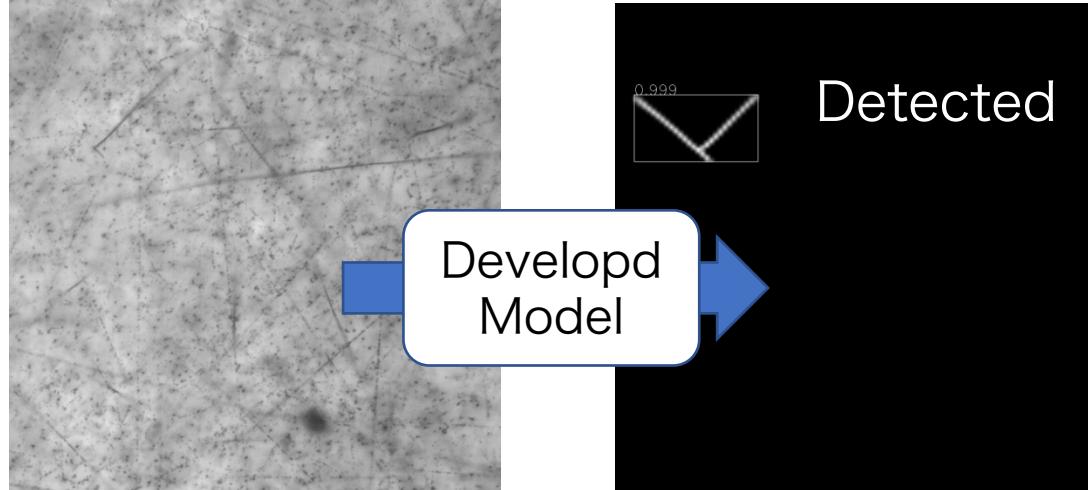
$^3\Lambda\text{H}$ 2-body decay



Simulated events



Real image

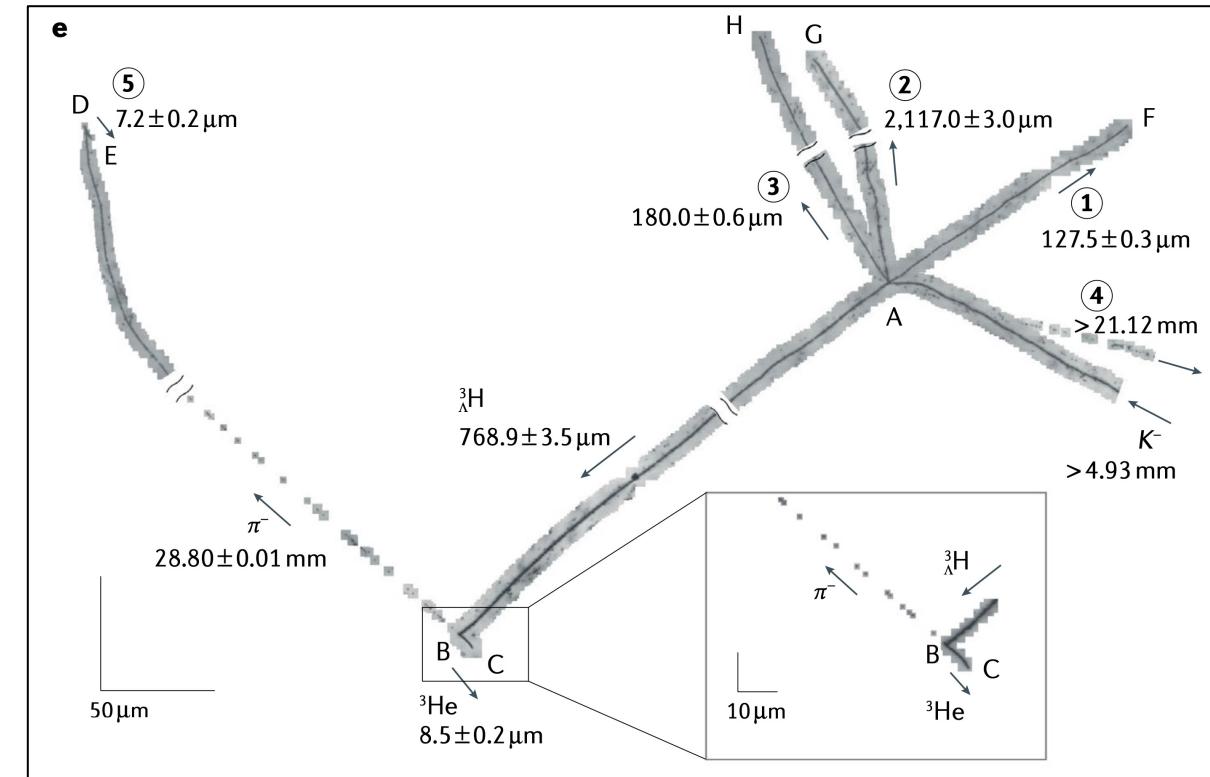


- Rare event was detected
- S/N ratio: $\sim 1/10^4$ improved

nature reviews physics

Perspective | Published: 14 September 2021

New directions in hypernuclear physics

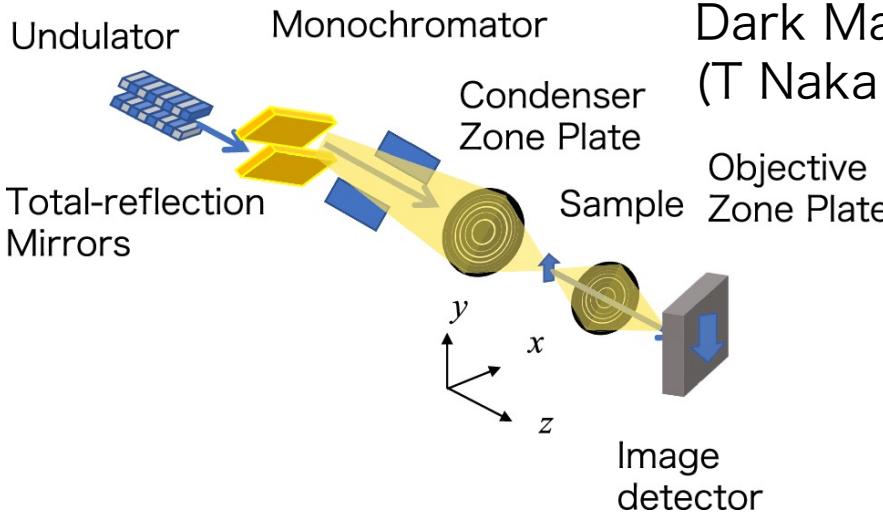


T.R Saito et.al, Nat Rev Phys 3, 803–813 (2021)

X-ray microscopy for Nuclear Emulsion

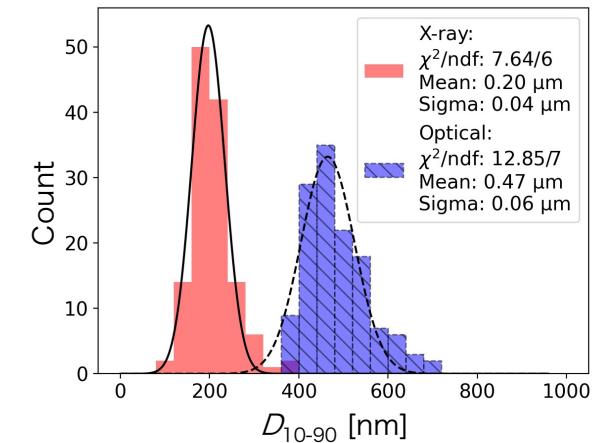
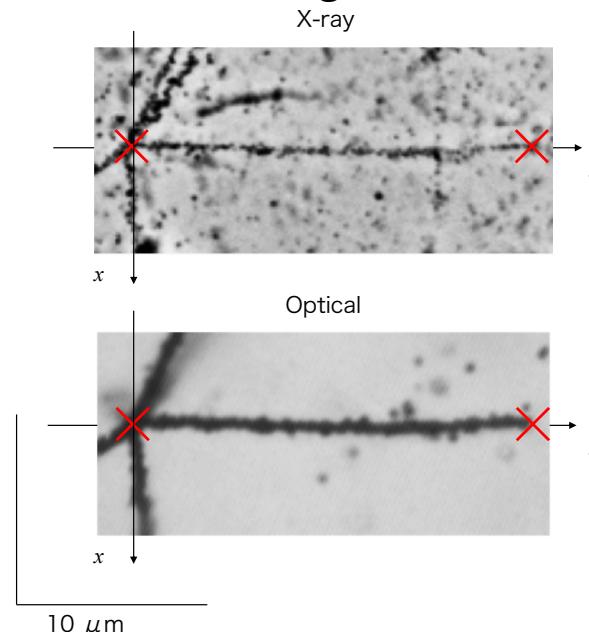
18/20

Spring-8



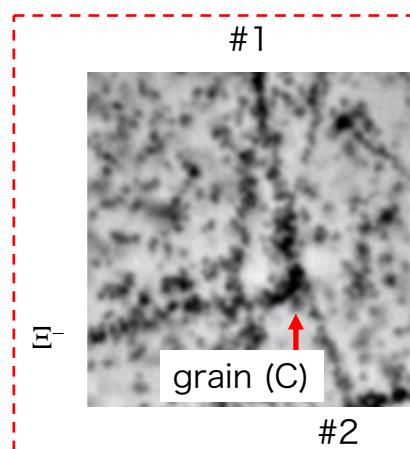
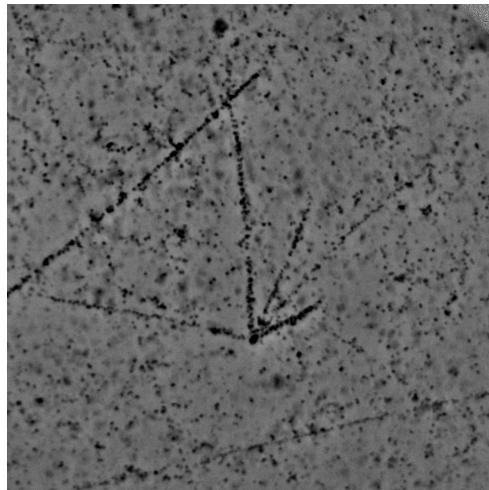
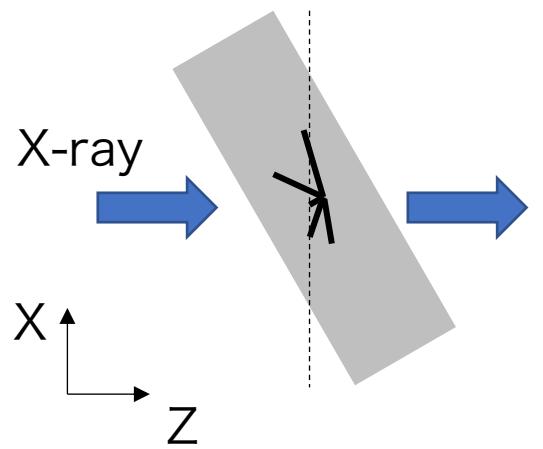
Initiated by
Dark Mater search
(T Naka et.al)

To achieve higher resolution for tracks



X-ray: $0.20 \pm 0.04 \mu\text{m}$
Optical: $0.47 \pm 0.06 \mu\text{m}$

3D analysis with stereo imaging



The unrelated grain was resolved
Position acc: $\pm 3 \mu\text{m} \rightarrow \pm 0.04 \mu\text{m}$

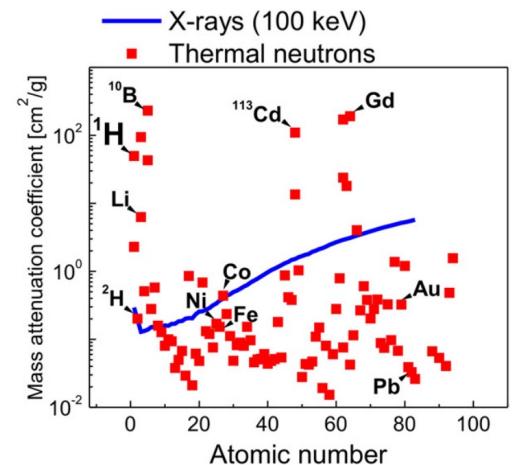
Interpretation of double-strange event
became possible

A. Kasagi et.al., EPJ-A. 58, 190 (2022)

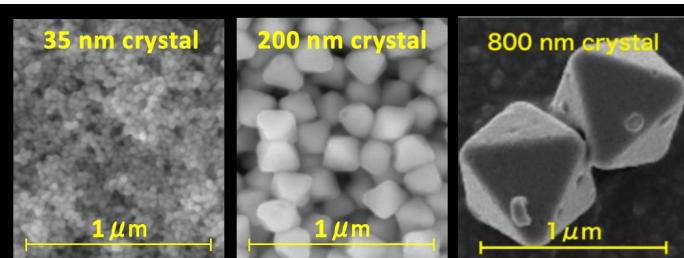
Precise Neutron imaging with tracking detector

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Neutron imaging: Hydrogen, Lithium, Boron



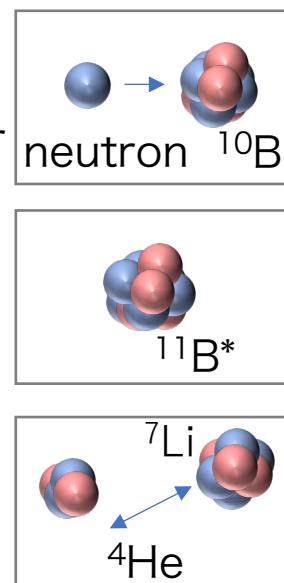
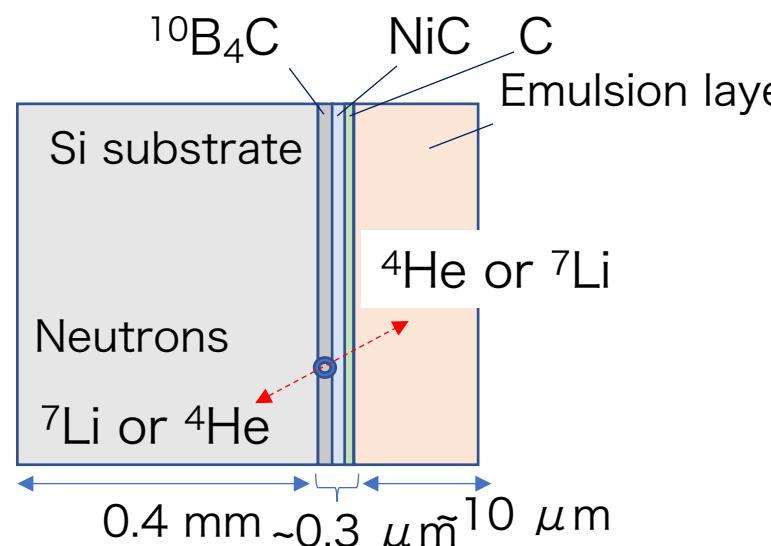
Fine-grain emulsion



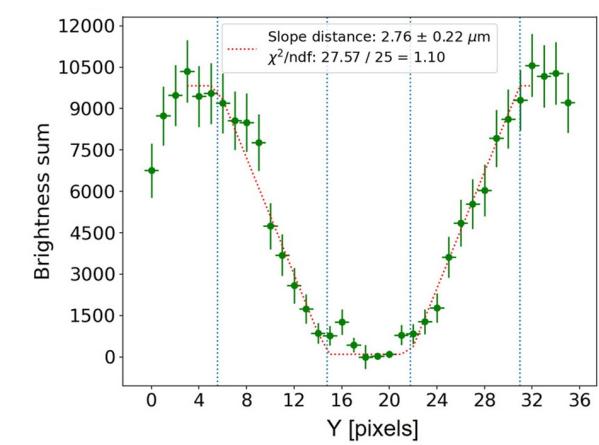
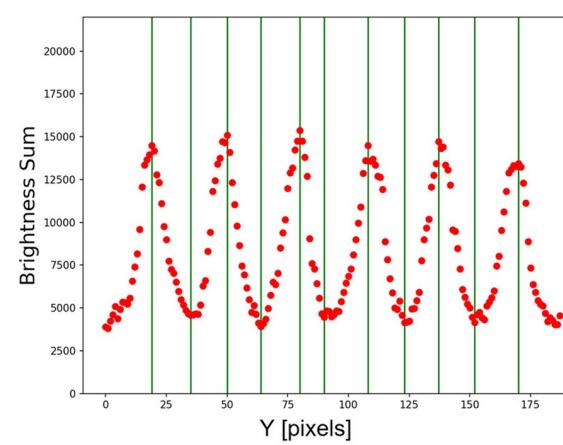
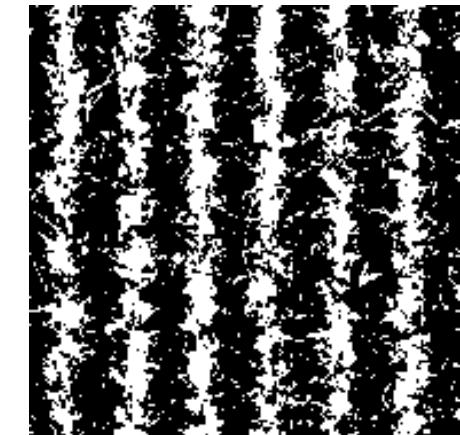
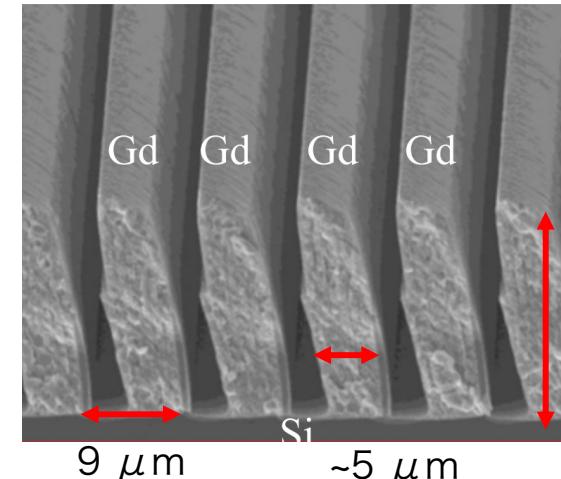
J. Imaging 2021, 7(1), 4

J. Phys. D: Appl. Phys. 42 (2009) 243001

Neutron detector with emulsion



Tetsuo Samoto et al., 2019 Jpn. J. Appl. Phys. 58 SDDF12



$\sigma = 0.945 \pm 0.004 \mu\text{m}$
cf. FNTD(fluorescent nuclear track detectors)

A. Muneem et.al, J. Appl. Phys. 133, 054902 (2023)

A. Muneem et.al, Radiation Measurements 158, 106863 (2022)

Photographic film: Nuclear emulsion

- History of Pioneering Particle Detection
- Automated analysis of tracks in emulsion sheets

→ New physics experiments & new applications

Nuclear emulsion + Machine learning

- Hypernuclear event search without any trigger conditions
- Machine learning for High efficiency + High speed

→ Efficiency: $\sim \times 2$, S/N ratio: $\sim \times 17$

→ Rare events can be studied with Nuclear emulsion

Further developments with nuclear emulsion

- X-ray microscopy, Neutron imaging

Unprecedented large statistical analysis + Precise measurement
Nuclear emulsion is not only historical but also matured imaging detector!