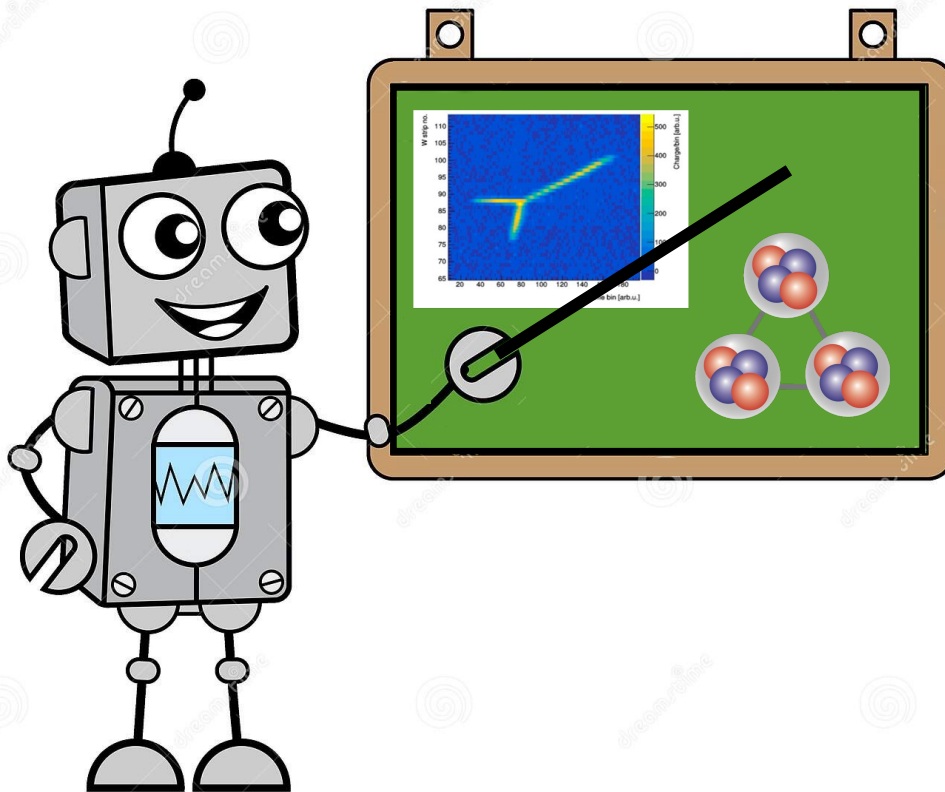


# Investigating clustering in $^{12}\text{C}$ with gamma-beams and a TPC detector

Robin Smith, Kristian C. Z. Haverson



# Collaborators

M. Cwiok<sup>1</sup>, W. Dominik<sup>1</sup>, A. Fijałkowska<sup>1</sup>, M. Fila<sup>1</sup>, Z. Janas<sup>1</sup>, A. Kalinowski<sup>1</sup>,  
 K. Kierzkowski<sup>1</sup>, M. Kuich<sup>1</sup>, C. Mazzocchi<sup>1</sup>, W. Oklinski<sup>1</sup>, M. Zaremba<sup>1</sup>, M. Gai<sup>2</sup>,  
 D. K. Schweitzer<sup>2</sup>, S. R. Stern<sup>2</sup>, S. Finch<sup>3,4</sup>, U. Friman-Gayer<sup>3,4</sup>, S. R. Johnson<sup>5,4</sup>,  
 T. M. Kowalewski<sup>4,5</sup>, D. L. Balabanski<sup>6</sup>, C. Matei<sup>6</sup>, A. Rotaru<sup>6</sup>, K. C. Z. Haverson<sup>7</sup>,  
 R. Smith<sup>7</sup>, A. Shenfield<sup>7</sup>, C. Wheldon<sup>8</sup>, Tz. Kokalova<sup>8</sup>, R. A.M. Allen<sup>8</sup>, M. R. Griffiths<sup>8</sup>,  
 S. Pirrie<sup>8</sup>, and P. Santa Rita Alcibia<sup>8</sup>

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<sup>2</sup> University of Connecticut, CT, USA

<sup>3</sup> Physics Department, Duke University, Durham, NC, USA

<sup>4</sup> Triangle Universities Nuclear Laboratory, Durham, NC, USA

<sup>5</sup> Dept of Physics & Astronomy, University of North Carolina, Chapel Hill, NC, USA

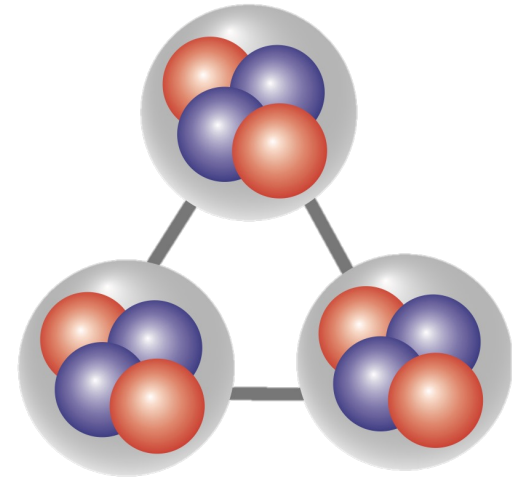
<sup>6</sup> IFIN-HH / ELI-NP, Bucharest-Magurele, Romania

<sup>7</sup> Dept of Engineering and Mathematics, Sheffield Hallam University, Sheffield, UK

<sup>8</sup> School of Physics and Astronomy, University of Birmingham, Birmingham, UK

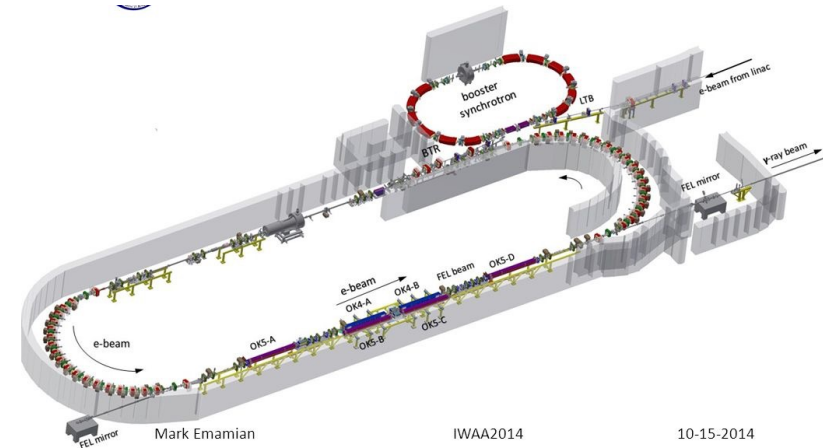
# Overview

- Physics case – alpha clustering in  $^{12}\text{C}$
- Photo-excitation with gamma beams at HIgS
- Warsaw electronic TPC and experiment
- Data analysis challenges
- Event classification neural network
- Preliminary results



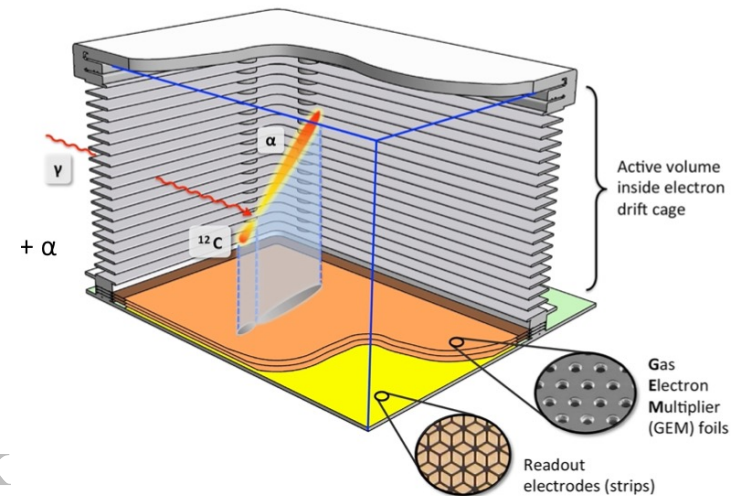
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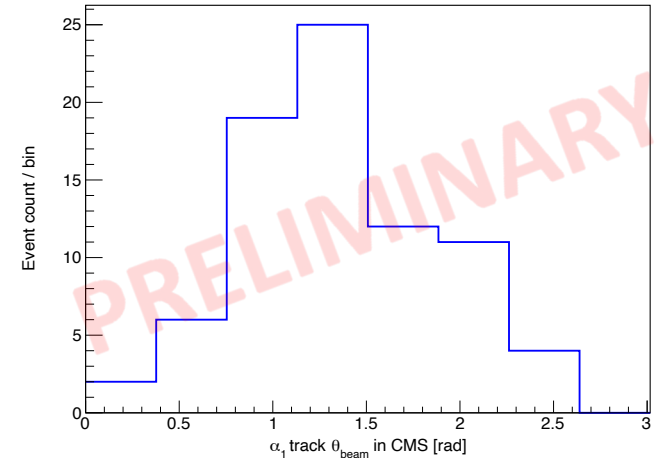
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# Overview

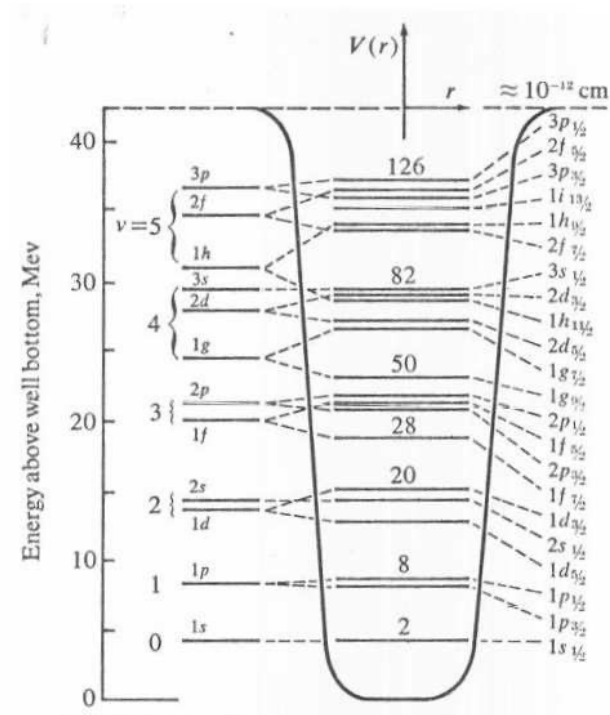
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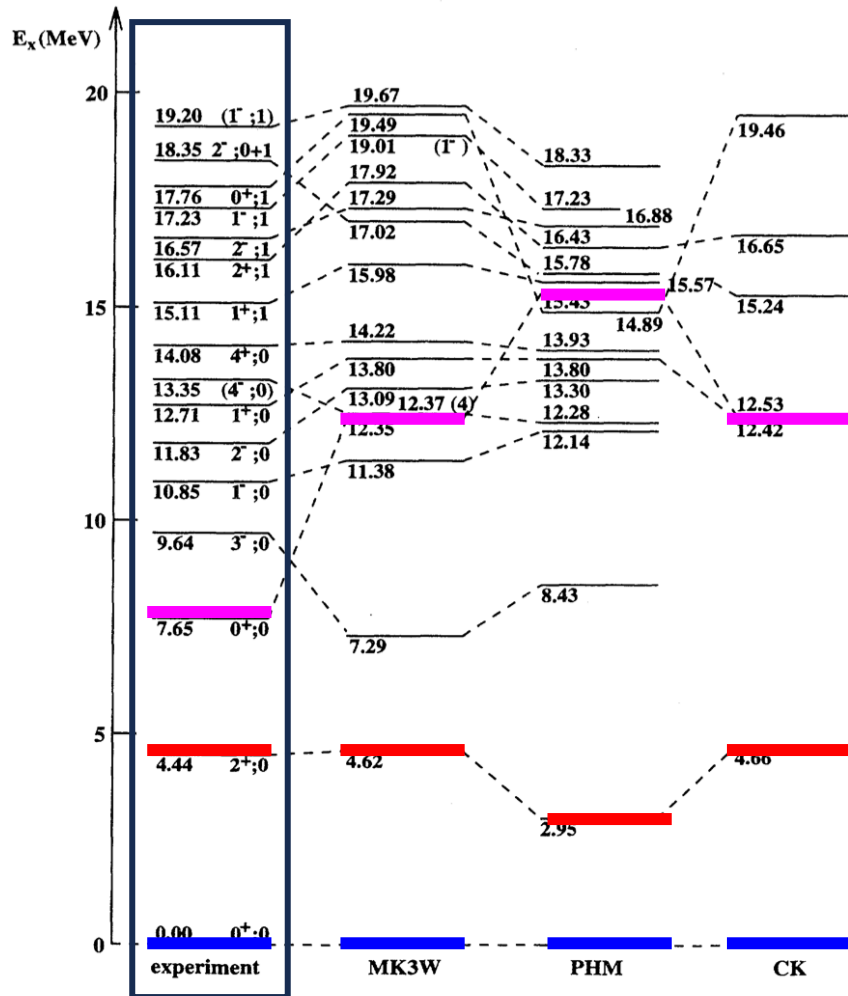


# Nuclear physics – complexity to simplicity

- Atomic nuclei are a quantum many body problem
  - Ab initio calculations possible but intensive
- Develop simplified models to describe nuclear properties
  - Shell model
  - Very successful

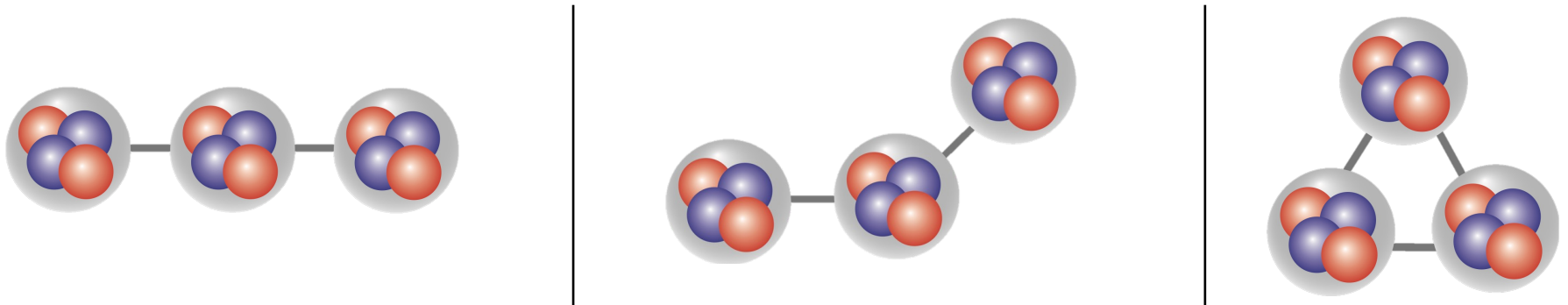


# $^{12}\text{C}$ – Shell Model to alpha clustering



- $0^+$  ground state and first excited  $2^+$  state binding energies are well-reproduced
- Hoyle state systematically under-bound
- Synthesised in nature – triple- $\alpha$  reaction

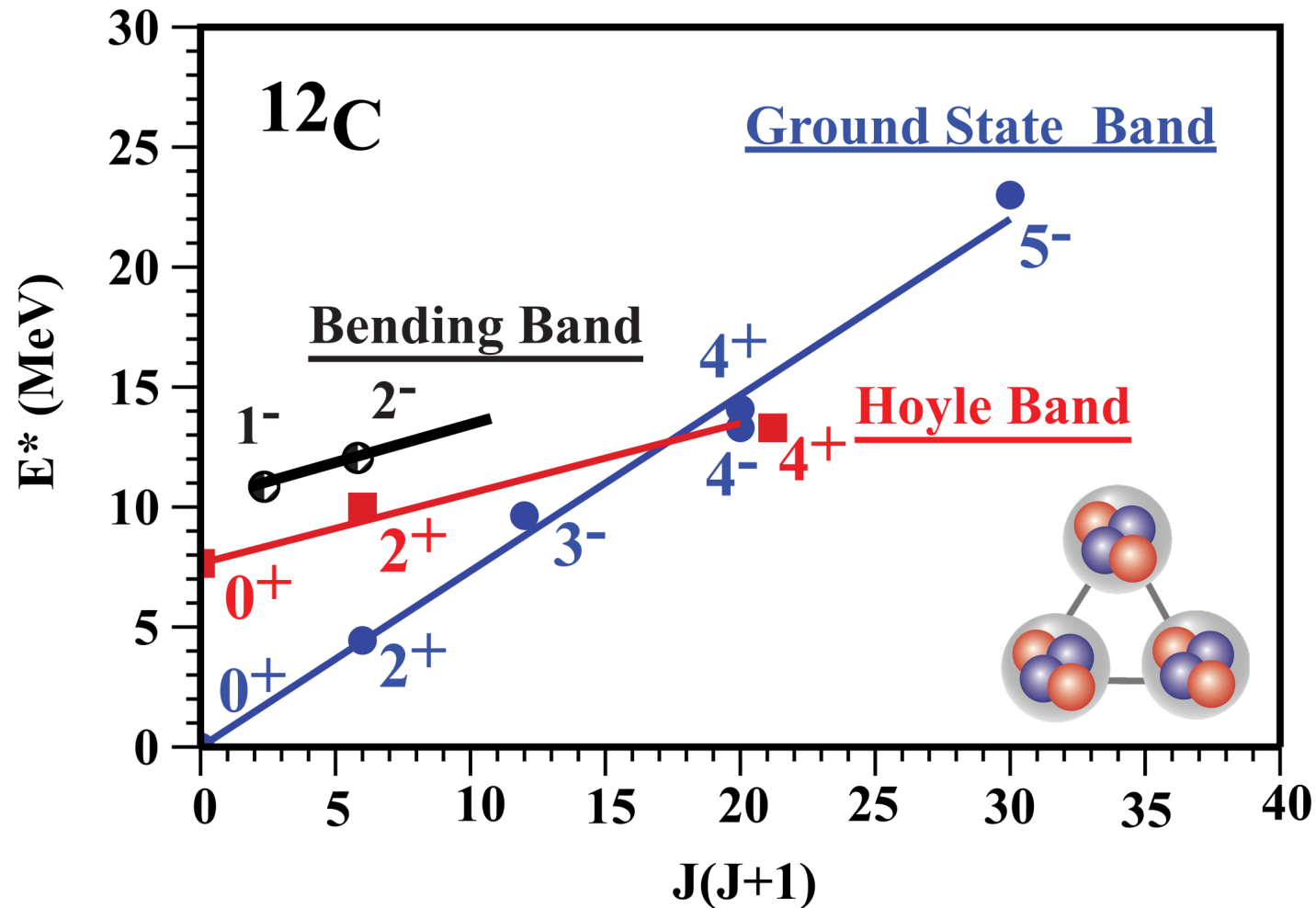
# Rotational Excitations: Nuclear Spinning Tops



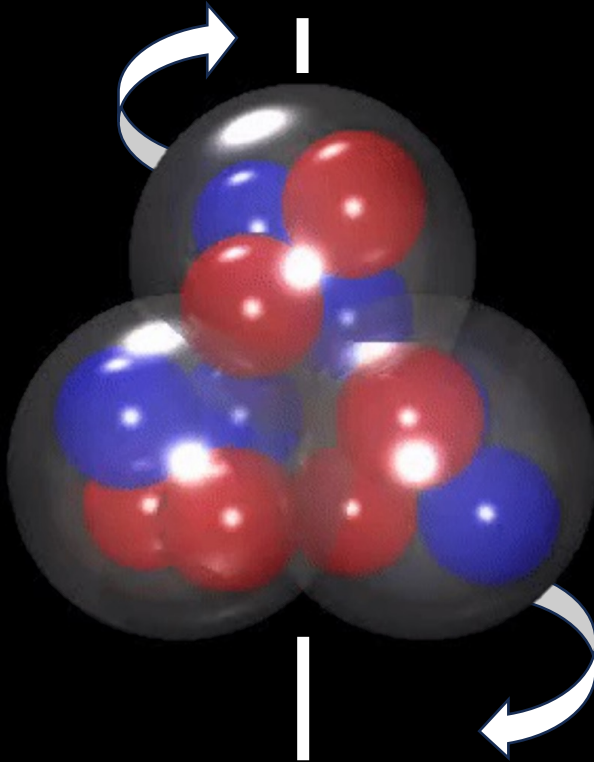
- Clustered nuclei can be excited by rotating the deformed system
- Deformed nuclei possess a moment of inertia,  $I$

- $$E_x = E_0 + \frac{\hbar^2}{2I} J(J + 1)$$

# Triangular $D_{3h}$ Symmetry Algebraic Cluster Model

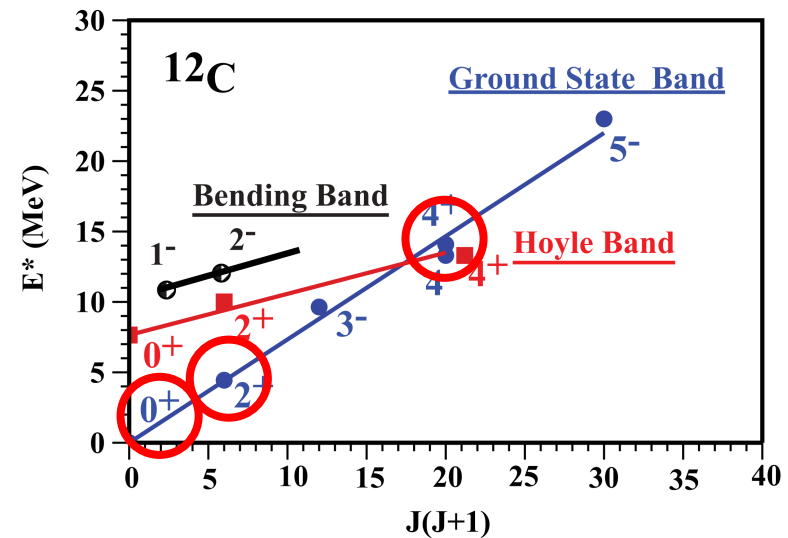


# Rotational Excitations

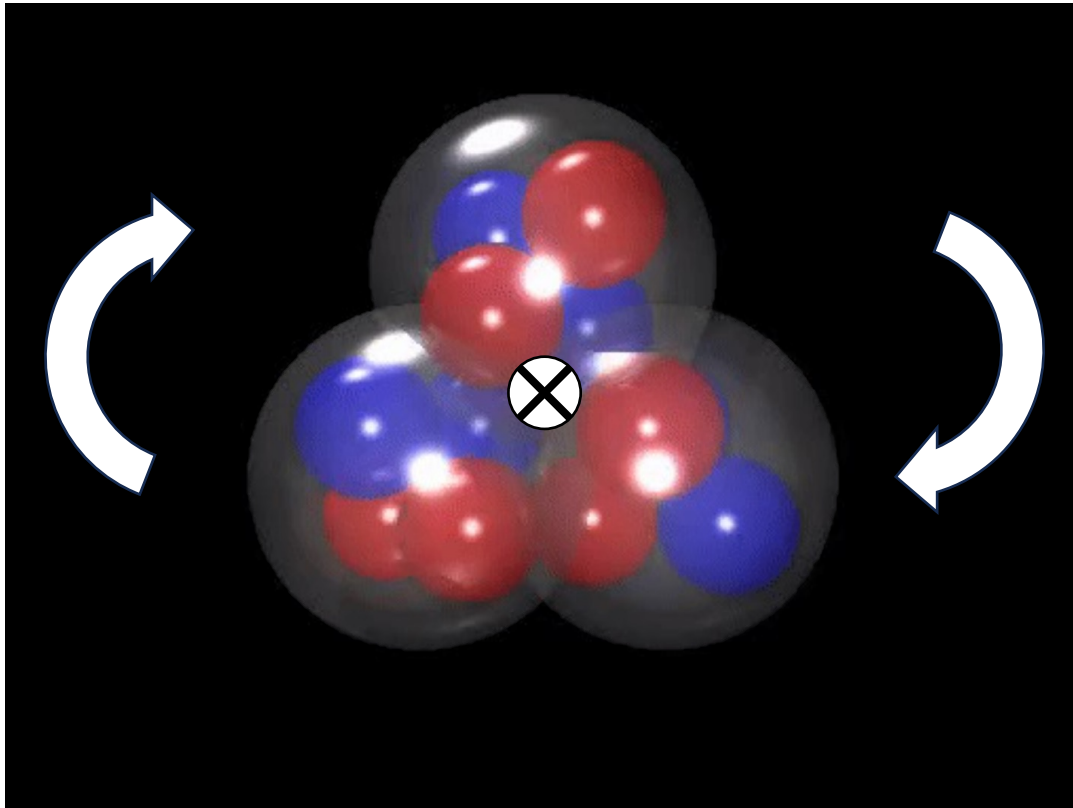


Generates states:

$0^+, 2^+, 4^+$

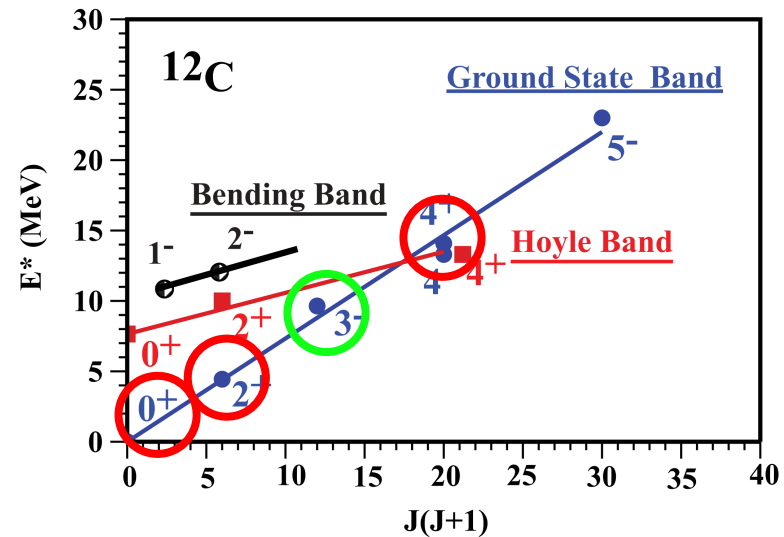


# Rotational Excitations

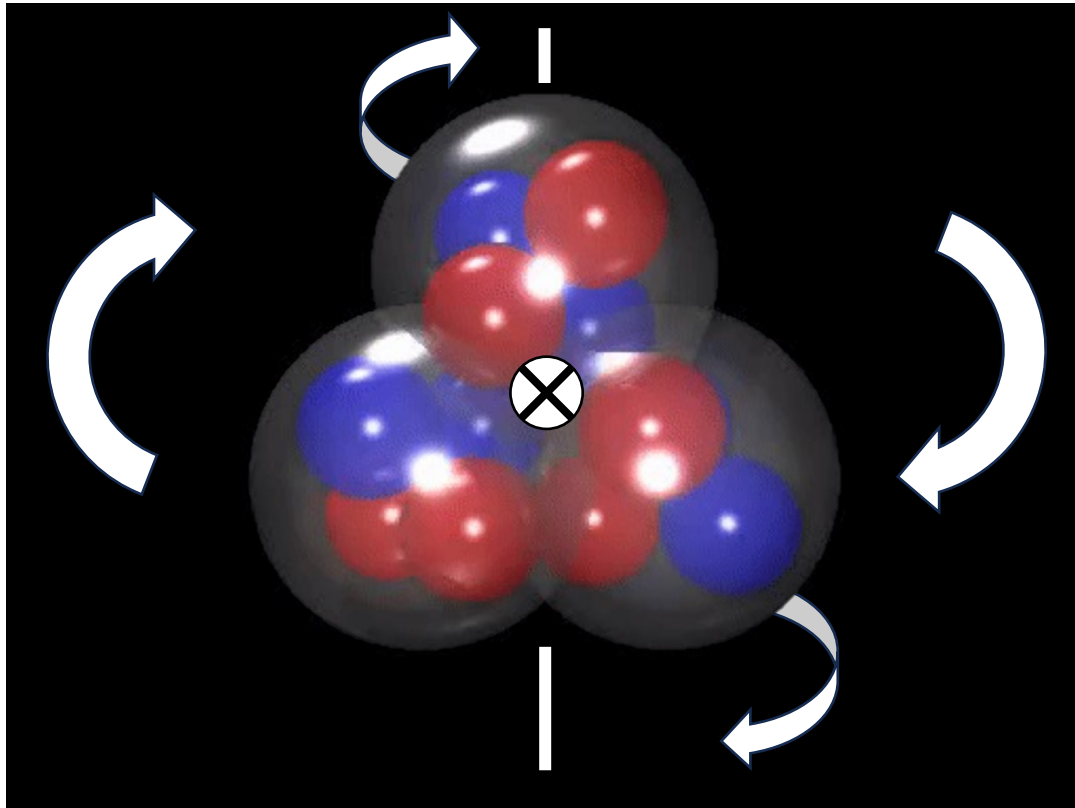


Generates state:

$3^-$

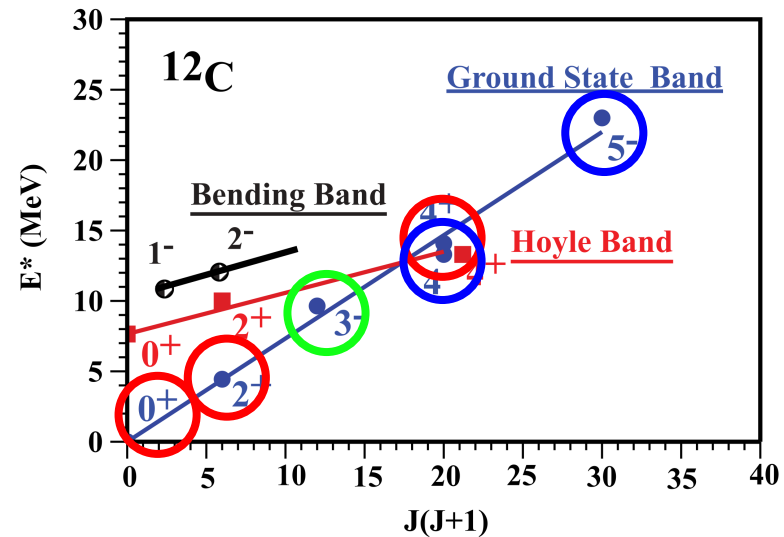


# Rotational Excitations

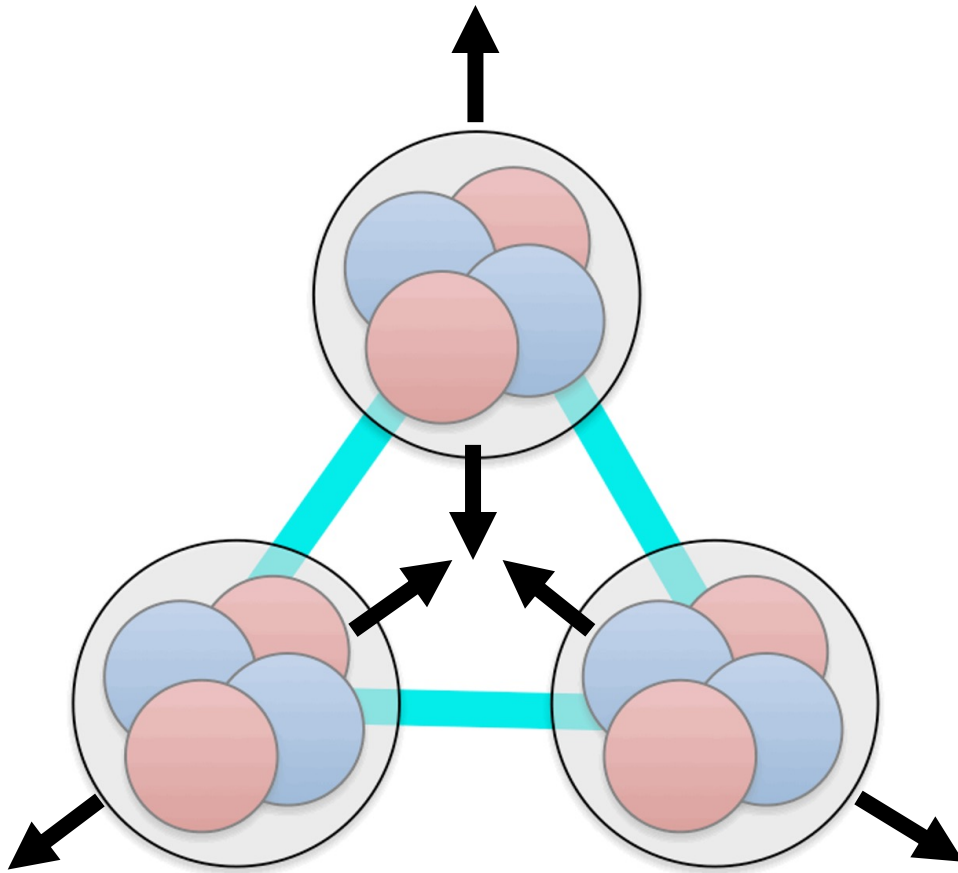


Generates state:

$4^-, 5^-$

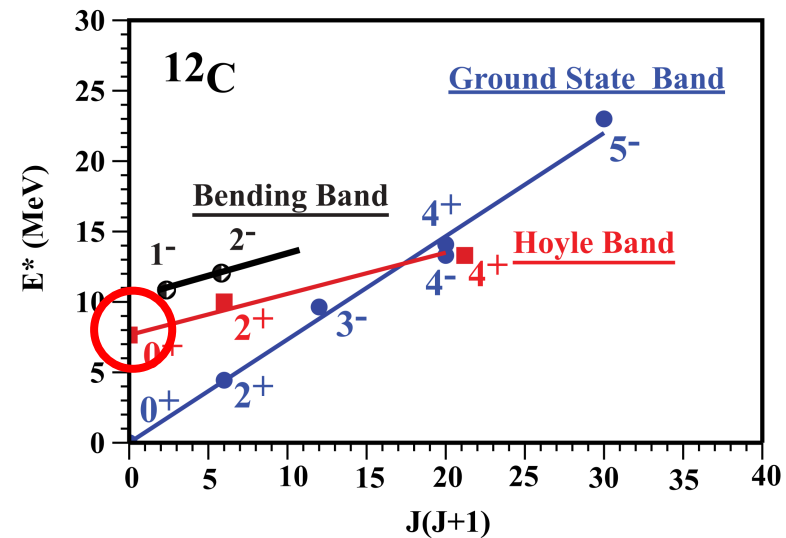


# Hoyle State: Breathing Mode



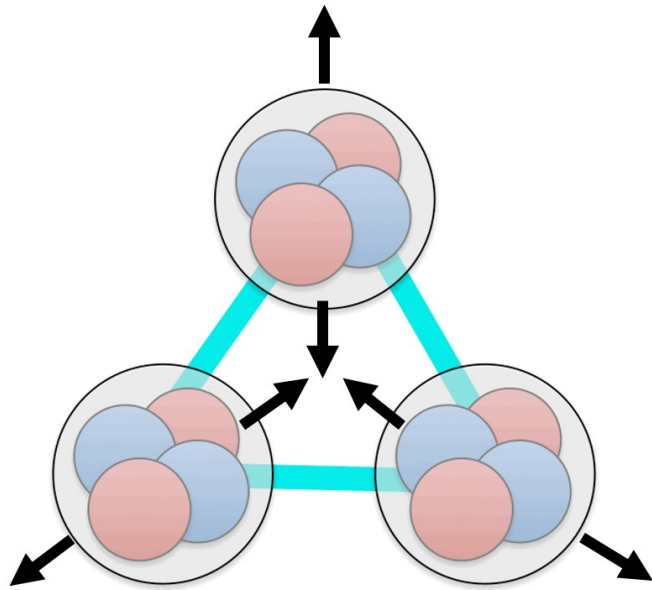
Generates states:

$0^+$ ,  $2^+$ ,  $4^+$ ,  $3^-$ ,  $4^-$ ,  $5^-$



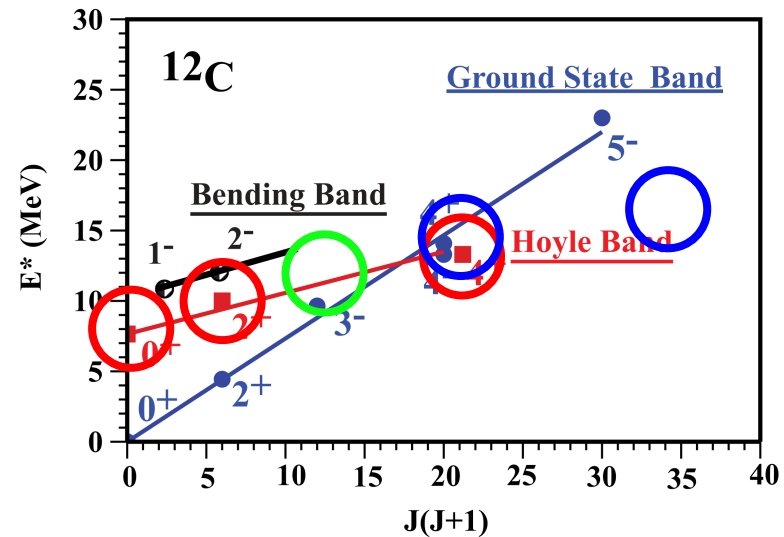
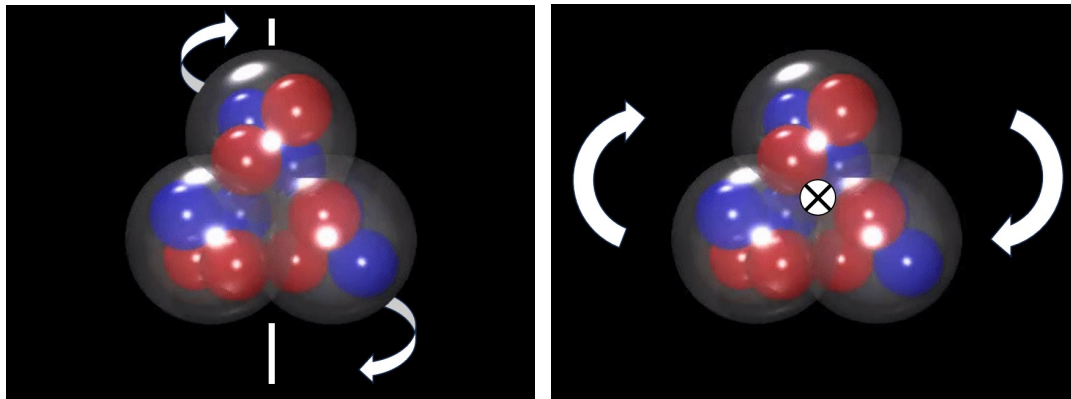


# Hoyle State: Rotational band



Generates states:

$0^+, 2^+, 4^+$ ,  $3^-, 4^-, 5^-$

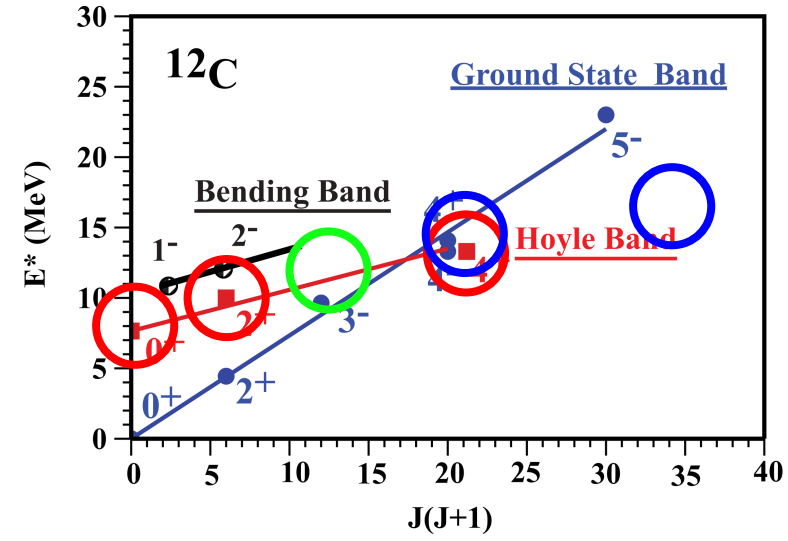
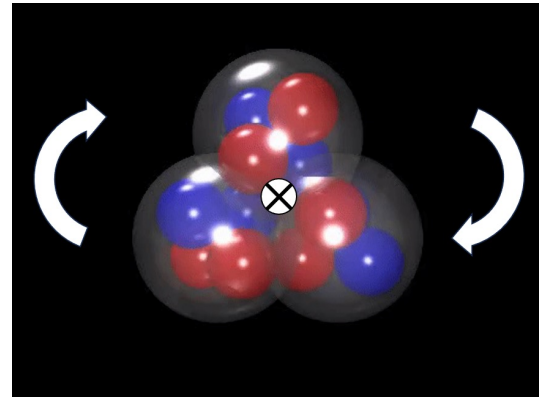
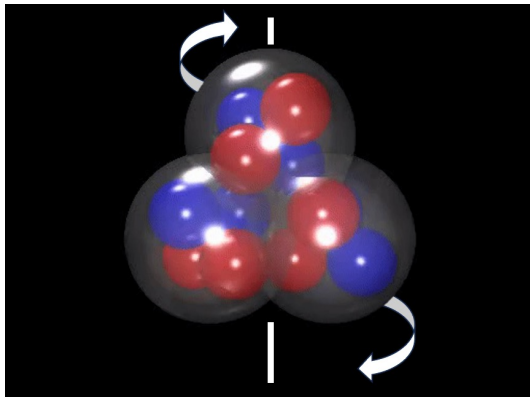
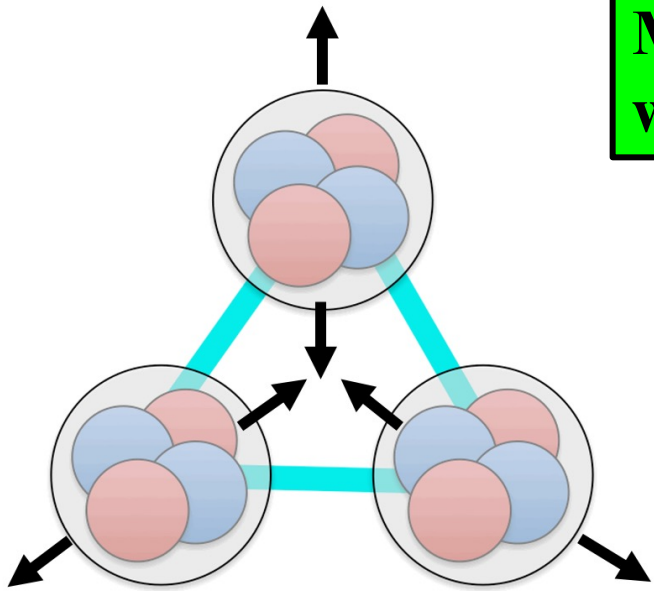


# Hoyle State: Rotational band

Measuring a  $3^-$  state 11-14 MeV would support this model of  $^{12}\text{C}$

Generates states:

$0^+, 2^+, 4^+, 3^-, 4^-, 5^-$

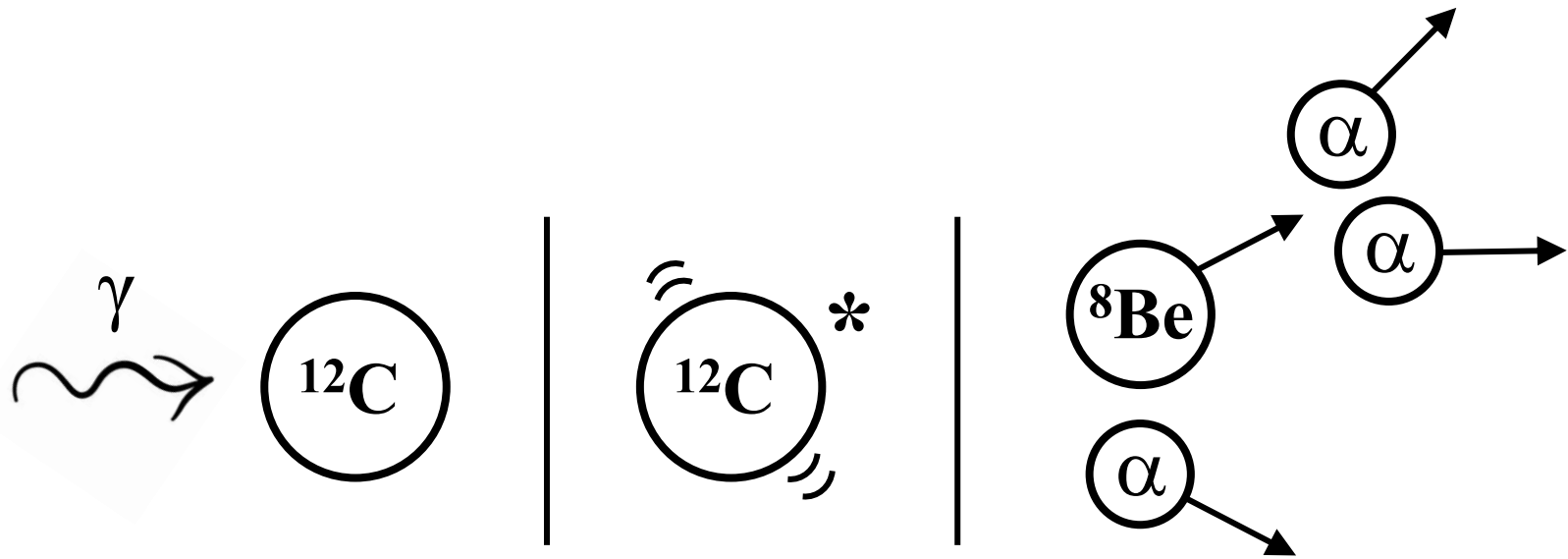


# Experimental challenges

- States above 10 MeV often broad
- Very broad  $0^+$  state at 10 MeV (width 3 MeV) produces significant background in this region
- High density of states

# Method – photo-dissociation reaction

- $^{12}\text{C}(\gamma, \alpha)^8\text{Be}$        $^{12}\text{C}(\gamma, \alpha_1)^8\text{Be}^*$



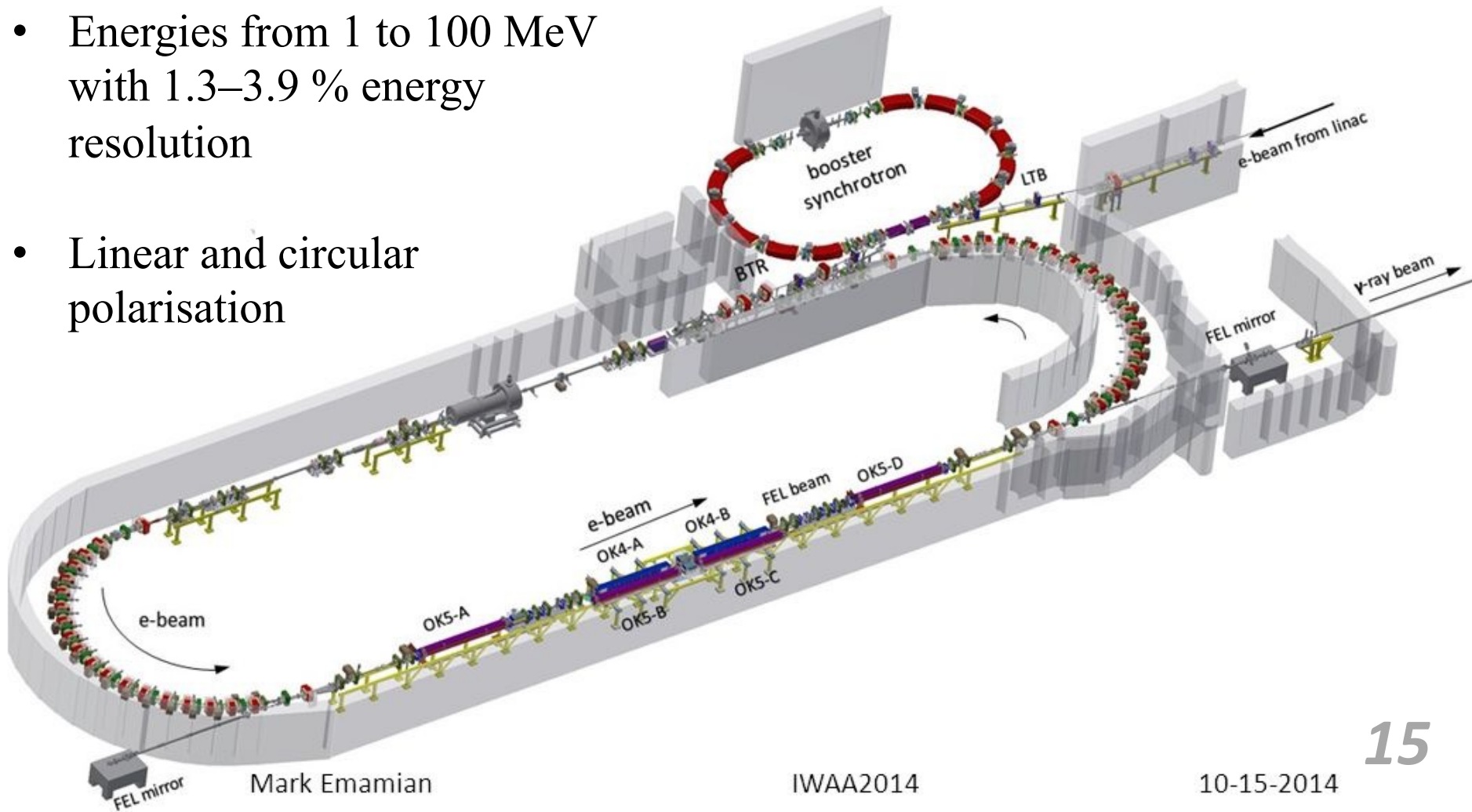
- Measuring kinematics of the final state particles elucidates angular momentum of the resonances

# Method – photo-dissociation reaction

- $^{12}\text{C}(\gamma, \alpha)^8\text{Be}$        $^{12}\text{C}(\gamma, \alpha_1)^8\text{Be}^*$
- Absorption of a photon cannot populate  $0^+$  states
- Tagging decays through  $\alpha + {}^8\text{Be}_{\text{gs}}(0^+)$  will restrict to natural parity states ( $1^-, 2^+, 3^-$ )
- Angular distributions & partial wave decomposition  
E1, E2, E3 cross sections
- **Require high intensity gamma beam and high-resolution charged particle detector (TPC)**

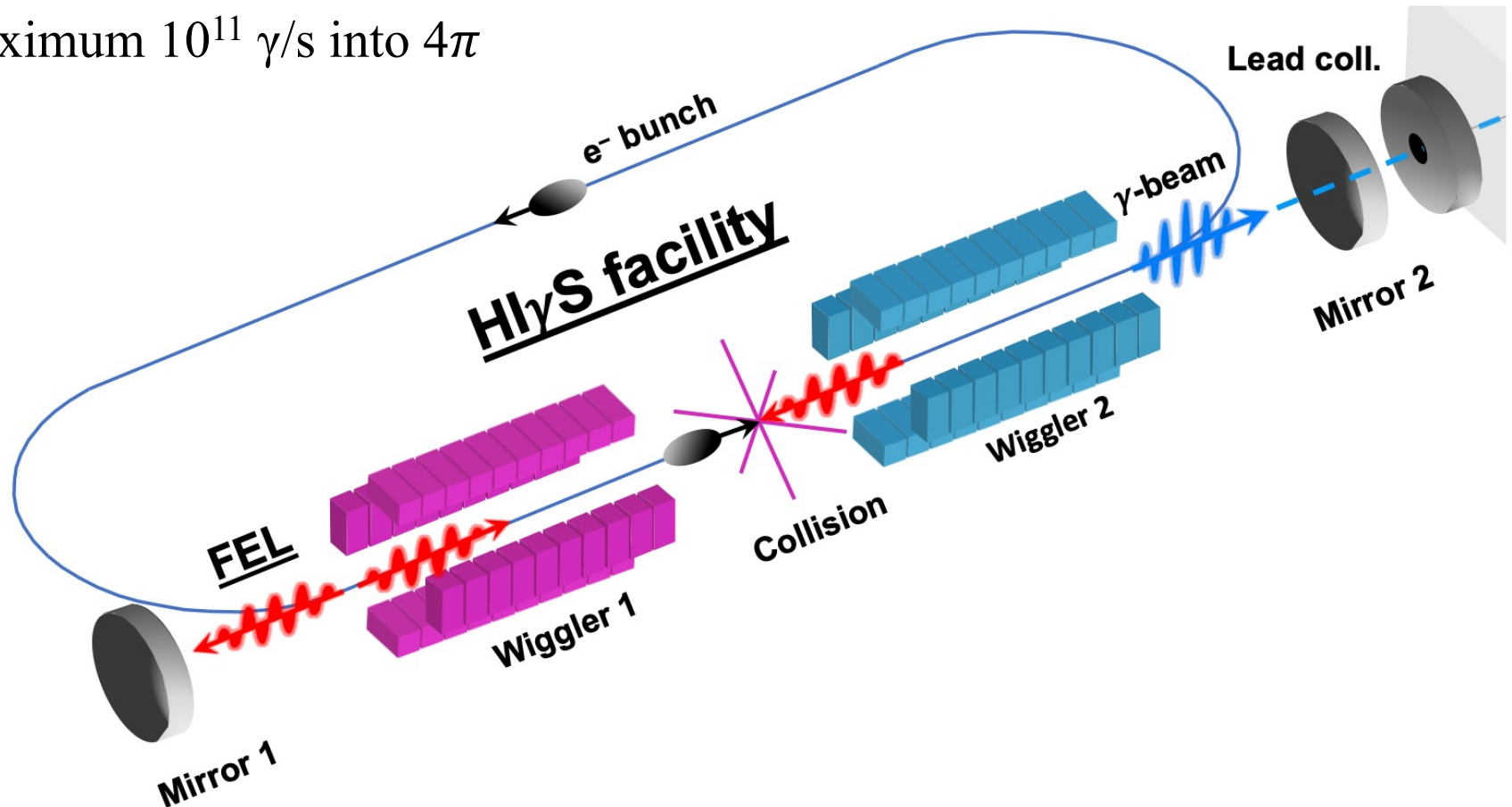
# HIγS facility

- Quasi-monoenergetic  $\gamma$ -beams
- Energies from 1 to 100 MeV with 1.3–3.9 % energy resolution
- Linear and circular polarisation



# H $\gamma$ S facility

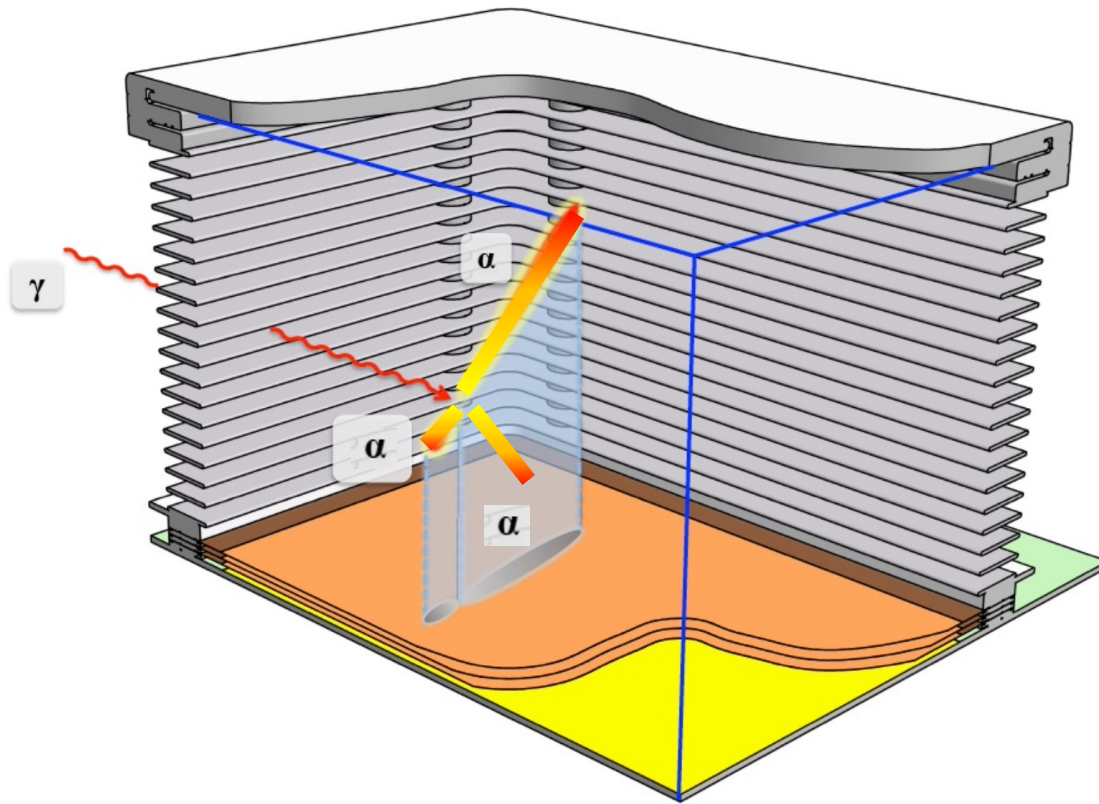
- Free electron laser –  $\lambda = 190 - 1064$  nm
- Compton backscattering increases the  $\gamma$  energy
- Maximum  $10^{11}$   $\gamma$ /s into  $4\pi$



H.R. Weller et. al, Progress in Particle and Nuclear Physics **62** (2009)

A. Endo, Laser Pulses-Theory, Technology, and Applications. InTech, (2012)

# Detector – Warsaw TPC



## Active volume

33 x 20 cm<sup>2</sup> (readout) x 20 cm (drift)

## Charge amplification

Gas Electron Multiplier (GEM) structures

## Readout

Planar, 3-coordinate, redundant strip arrays, ~1000 channels  
GET electronics  
100 Hz triggering

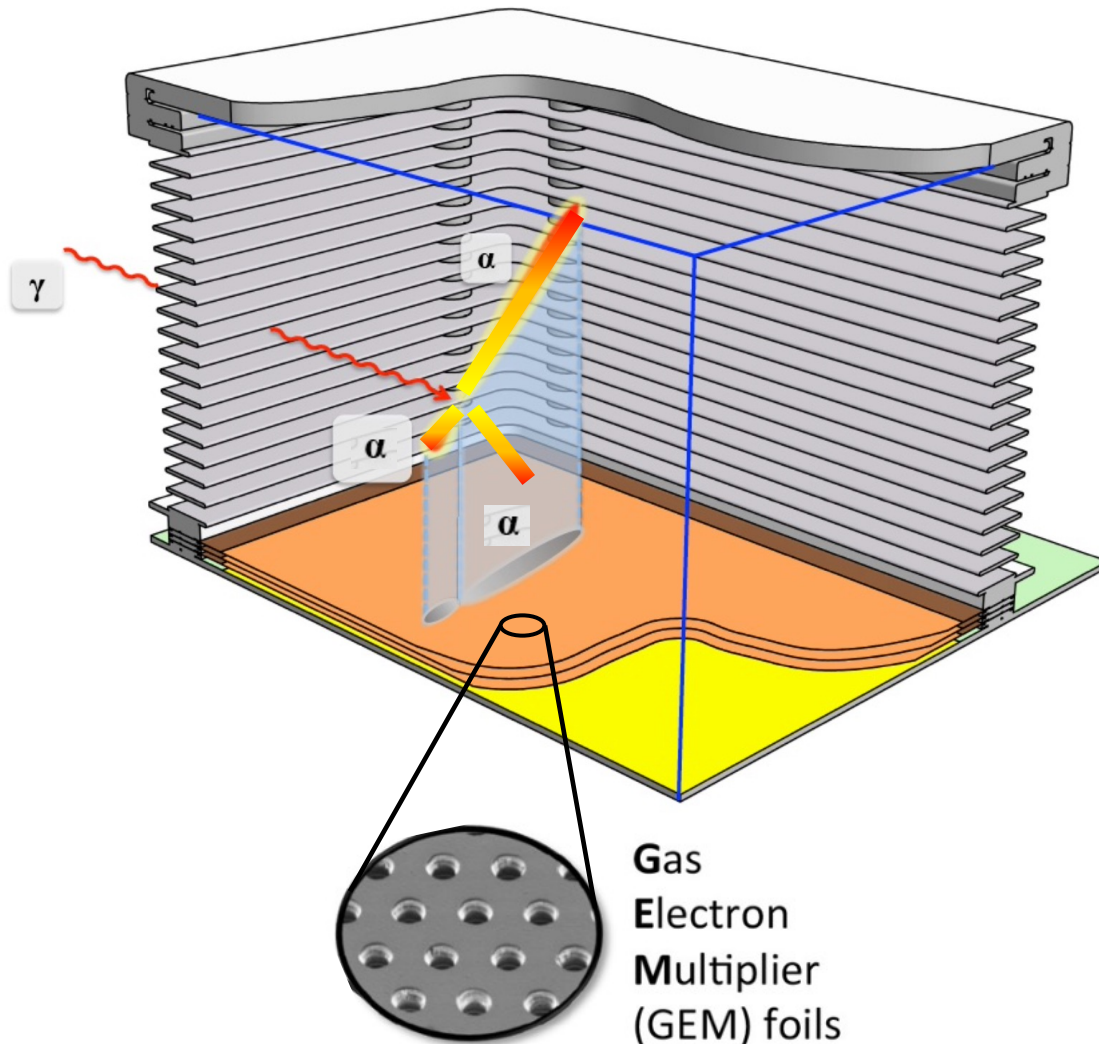
Kuich, M., et al. "Active target TPC for study of photonuclear reactions at astrophysical energies." *arXiv preprint arXiv:2303.08048* (2023).

M. Ćwiok et al. *Acta Phys.Pol. B*, 49:509, 2018.

Gai, M., et al (2020). *Nuclear Instruments and Methods in Physics Research Section A*, 954, 161779.



# Detector – Warsaw TPC



## Active volume

33 x 20 cm<sup>2</sup> (readout) x 20 cm (drift)

## Charge amplification

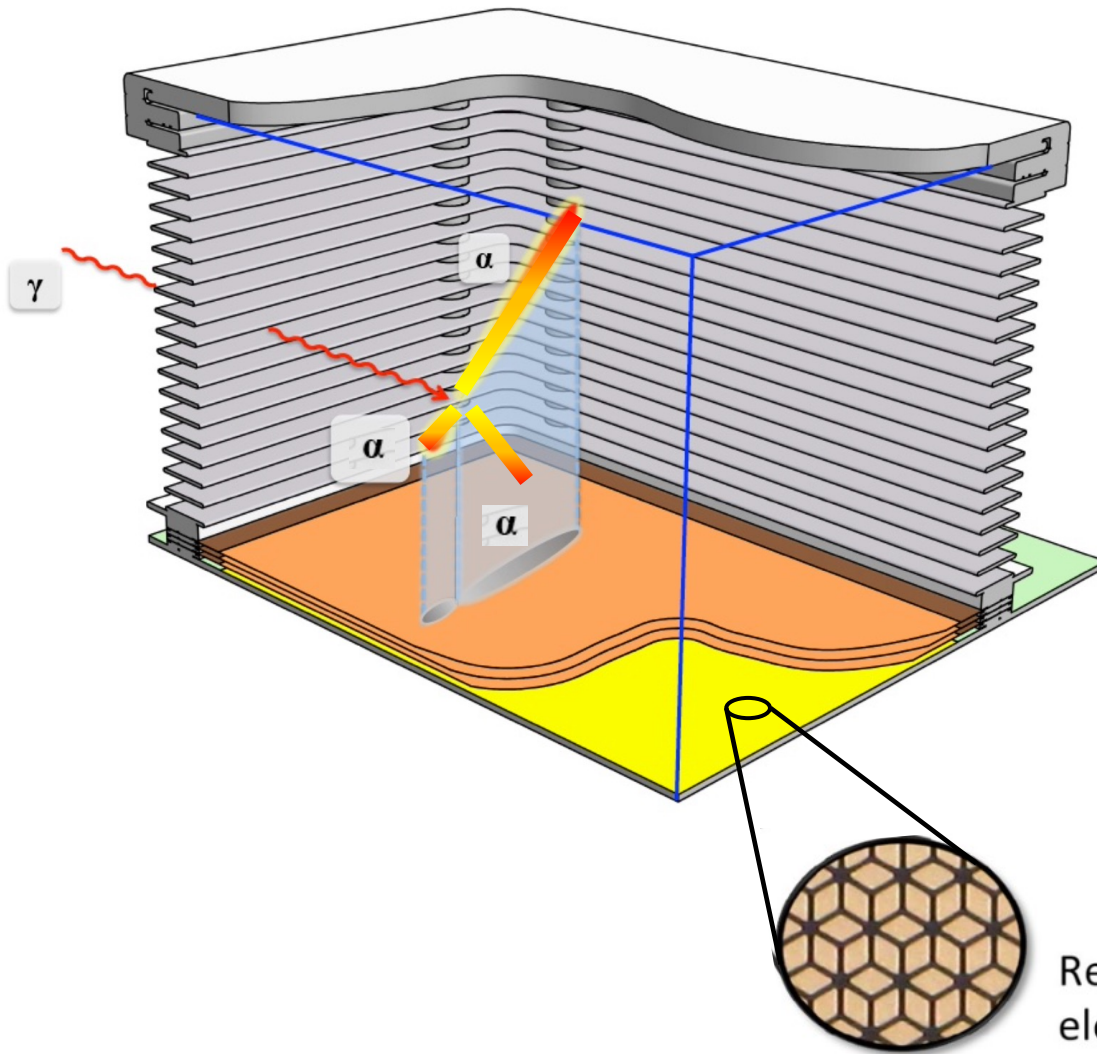
Gas Electron Multiplier (GEM) structures

## Readout

Planar, 3-coordinate, redundant strip arrays, ~1000 channels  
GET electronics  
100 Hz triggering

**Gas  
Electron  
Multiplier  
(GEM) foils**

# Detector – Warsaw TPC



## Active volume

33 x 20 cm<sup>2</sup> (readout) x 20 cm (drift)

## Charge amplification

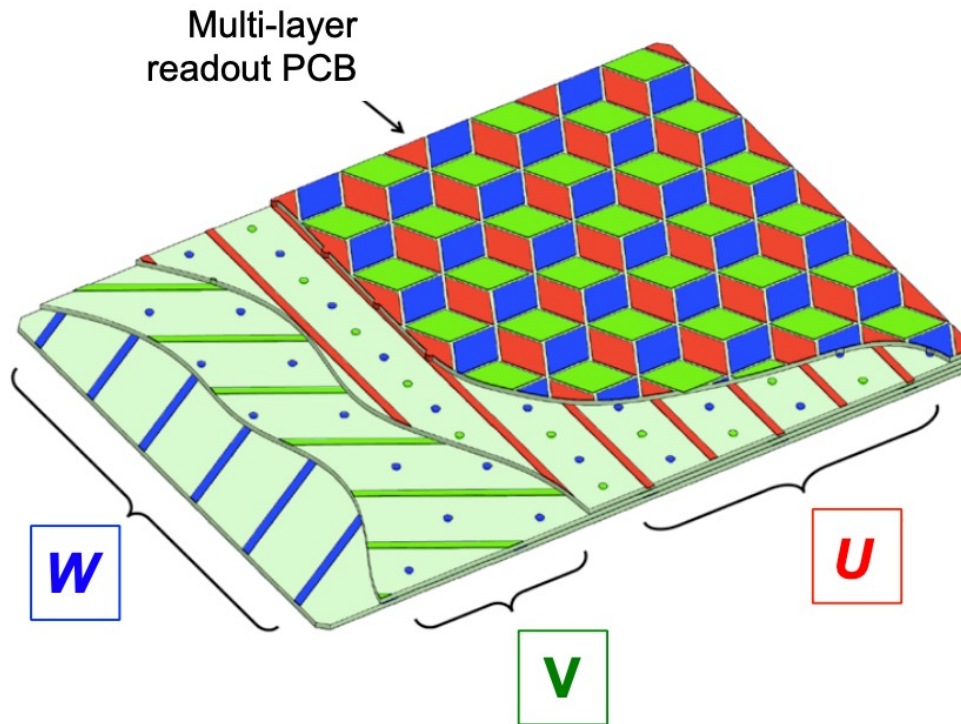
Gas Electron Multiplier (GEM) structures

## Readout

Planar, 3-coordinate, redundant strip arrays, ~1000 channels  
GET electronics  
100 Hz triggering

Readout electrodes (strips)

# Detector – Warsaw TPC



## Active volume

33 x 20 cm<sup>2</sup> (readout) x 20 cm (drift)

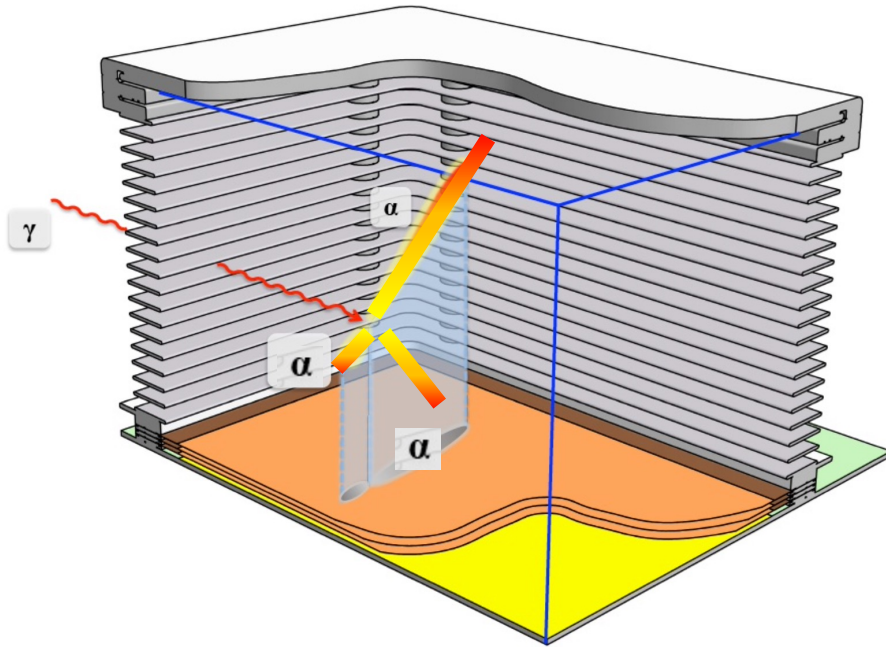
## Charge amplification

Gas Electron Multiplier (GEM) structures

## Readout

Planar, 3-coordinate, redundant strip arrays, ~1000 channels  
GET electronics  
100 Hz triggering

# HIγS campaign – 2022



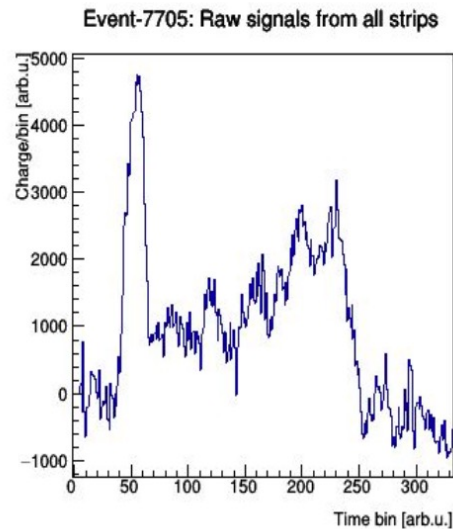
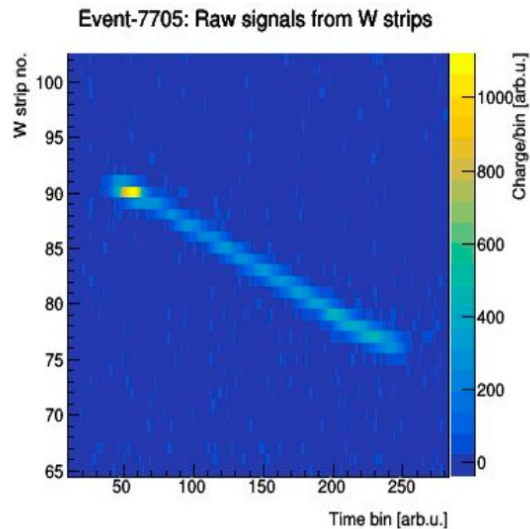
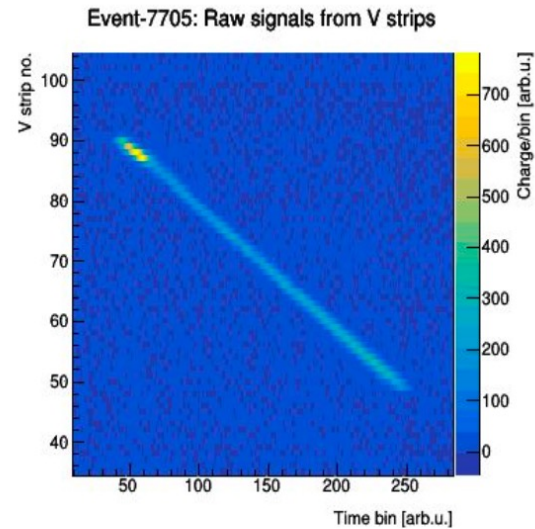
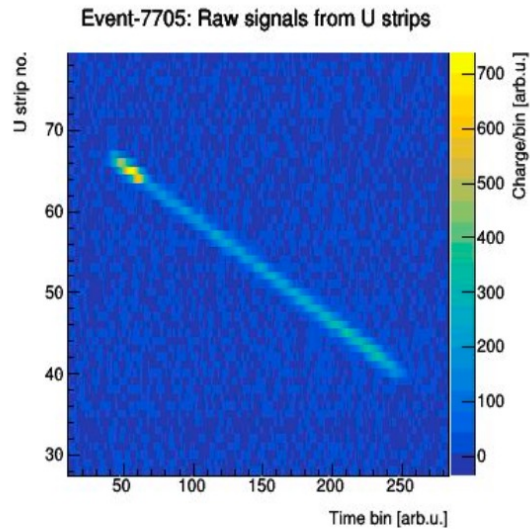
100–150 mbar pure CO<sub>2</sub> gas

γ-beams from between 8.6 and 13.9 MeV

~ 4 × 10<sup>9</sup> γ/s and ΔE ~ 3%

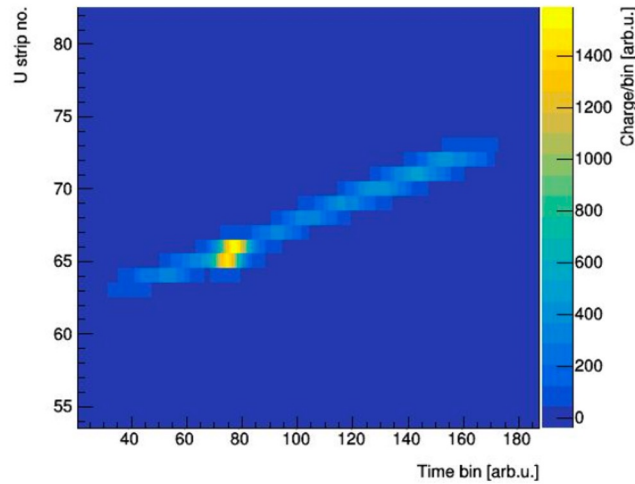


# Example events – $^{16}\text{O}(\gamma,\alpha)^{12}\text{C}$

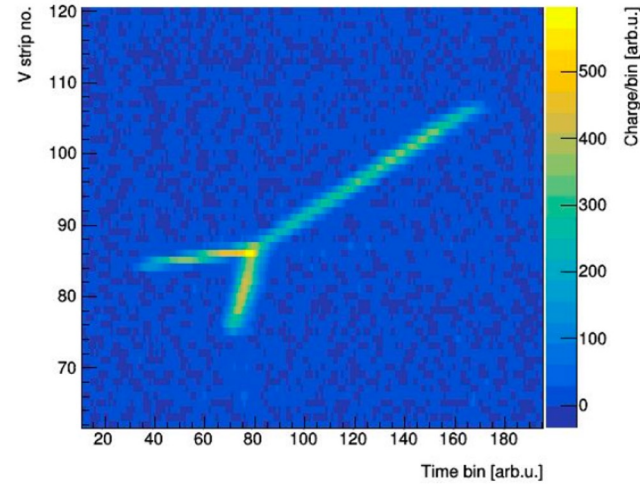


# Example events – $^{12}\text{C}(\gamma, \alpha_1)$

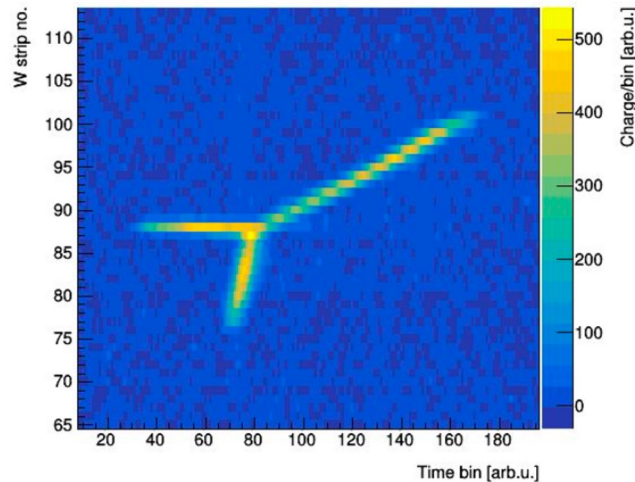
Event-8665: Raw signals from U strips



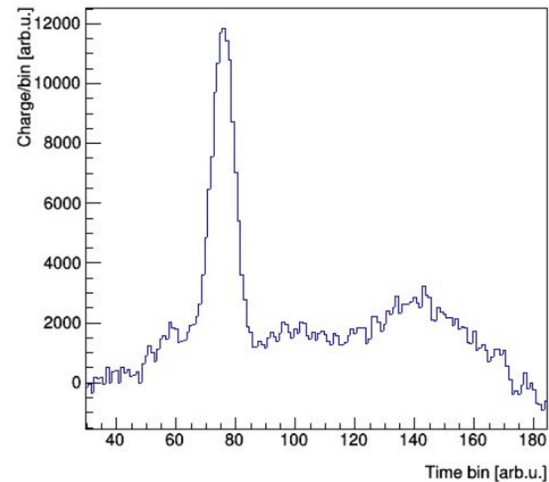
Event-8665: Raw signals from V strips



Event-8665: Raw signals from W strips

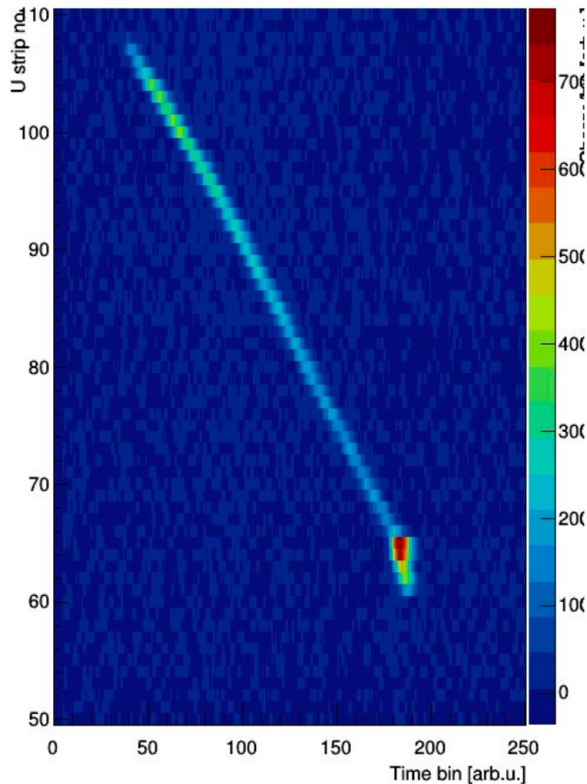


Event-8665: Raw signals from all strips

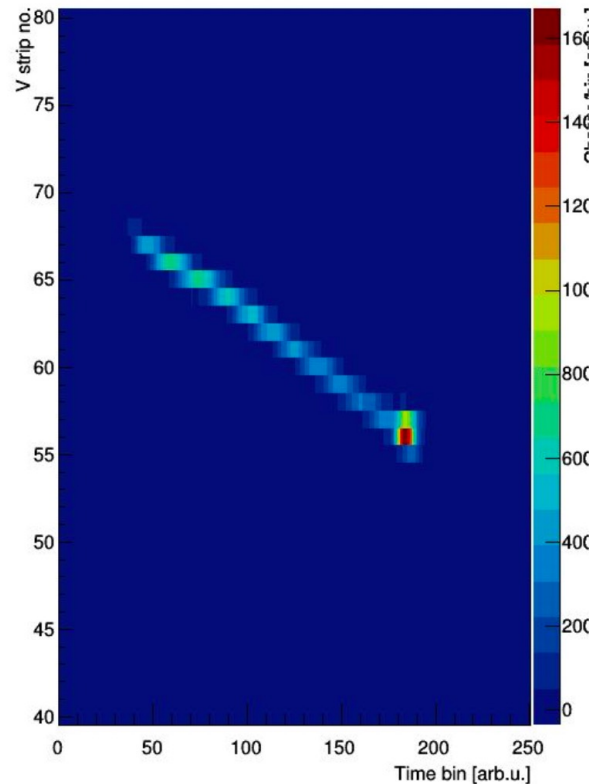


# Example events – $^{12}\text{C}(\gamma,\alpha)^8\text{Be}_{\text{gs}}$

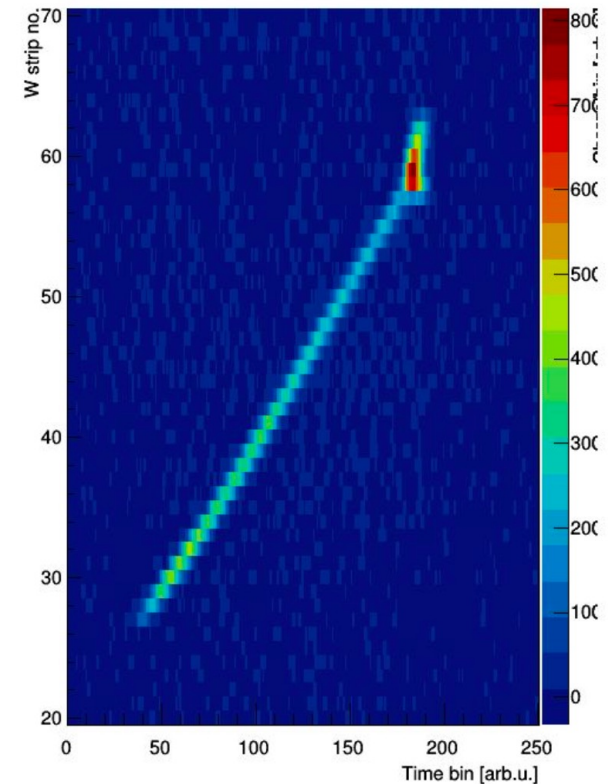
Event-14733: Raw signals from U strips



Event-14733: Raw signals from V strips



Event-14733: Raw signals from W strips

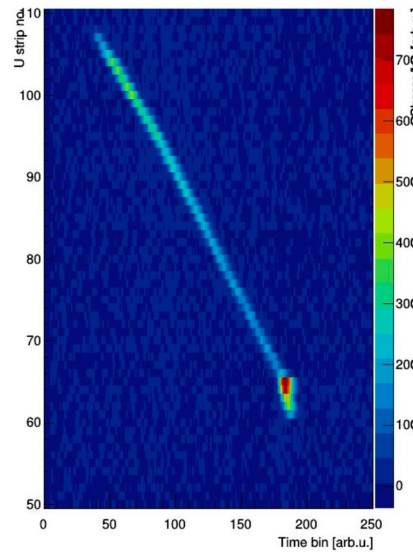


One long alpha track

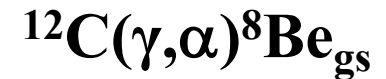
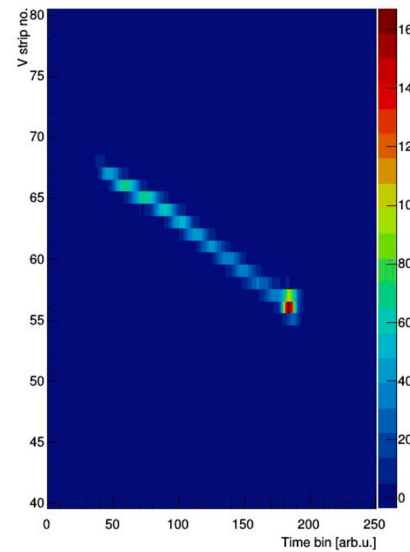
$^8\text{Be}$  decays to two short alpha tracks with small opening angle

# Example events – comparison

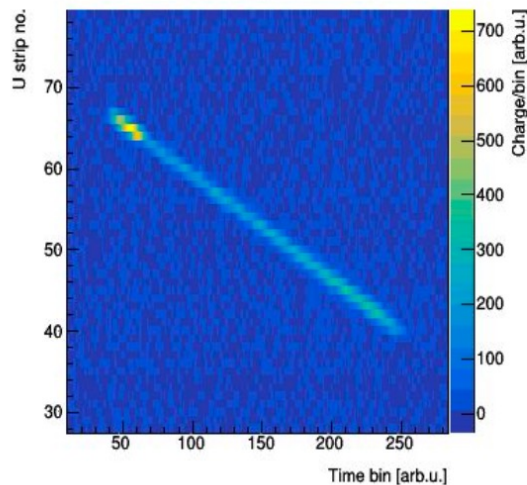
Event-14733: Raw signals from U strips



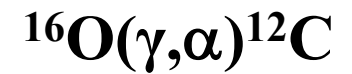
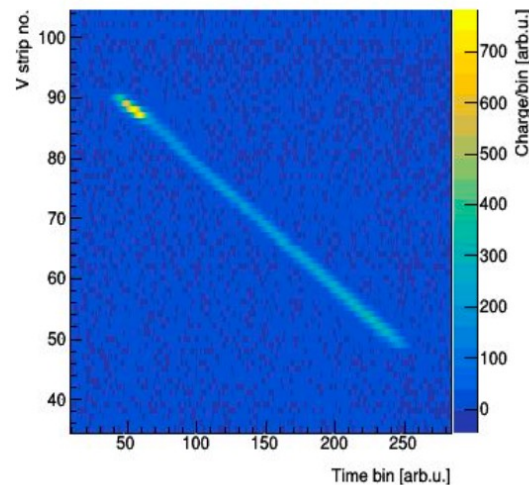
Event-14733: Raw signals from V strips



Event-7705: Raw signals from U strips

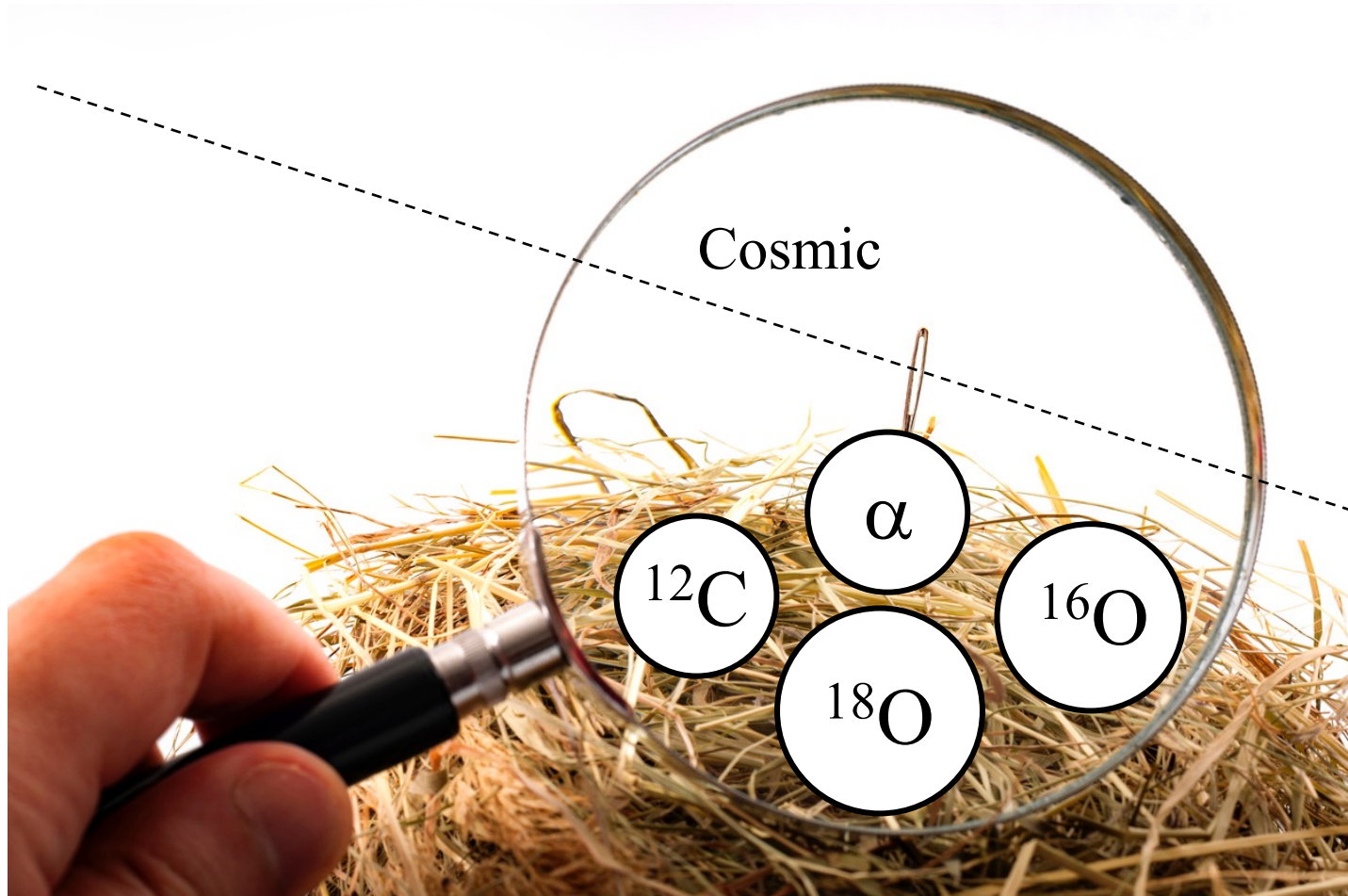


Event-7705: Raw signals from V strips





# Analysis: Finding a $^{12}\text{C}$ needle in a haystack



# Analysis: Finding a $^{12}\text{C}$ needle in a haystack



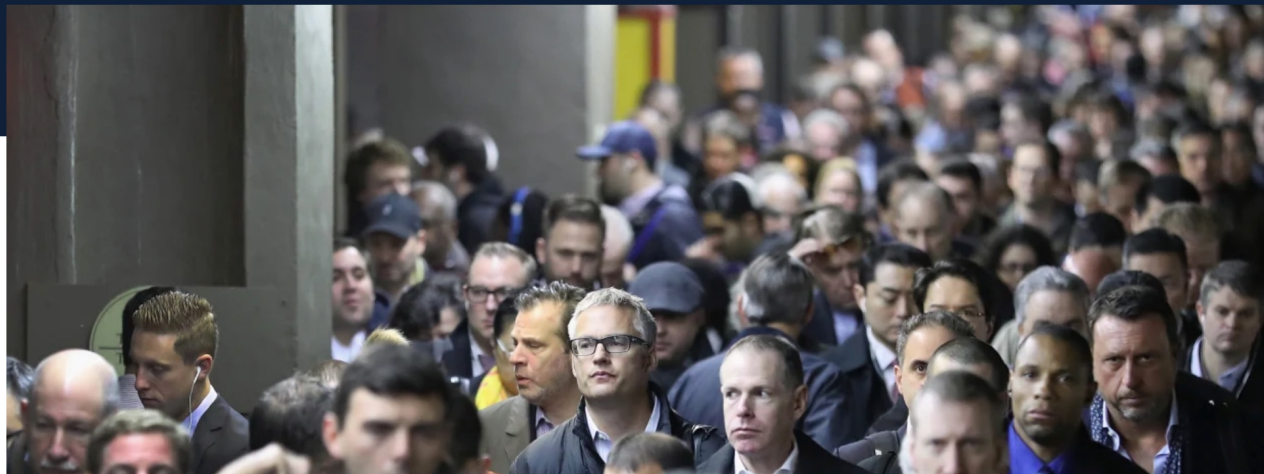
# **Artificial Neural Network for event classification**

# Artificial Neural Network for event classification

U.S. NEWS

## Facial recognition gives police a powerful new tracking tool. It's also raising alarms.

"It's not too late for someone to take a stand and keep this from happening," said the CEO of a facial recognition company.




# Artificial Neural Network for event classification

The New York Times

[A.I. and Chatbots >](#) | [Test A.I.'s Literary Skills](#) | [Spot the A.I. Image](#) | [Is This Robot Making Art?](#) | [How 35 Real People Use A.I.](#) | [What Are the Dangers of A.I.?](#)

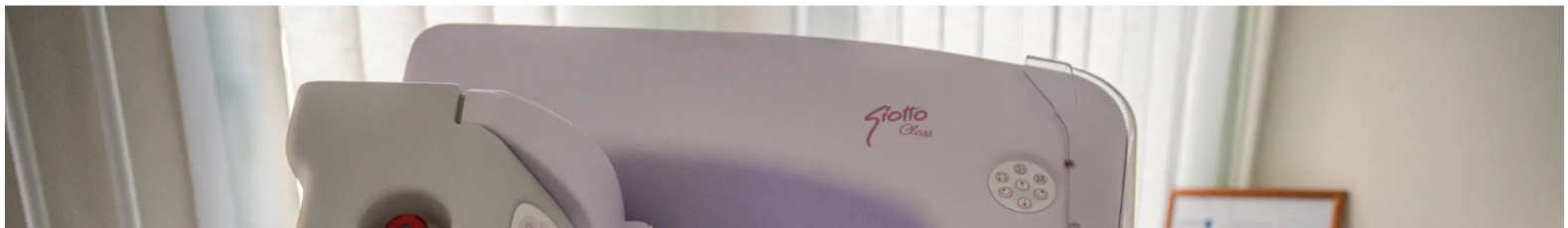
## *Using A.I. to Detect Breast Cancer That Doctors Miss*

Hungary has become a major testing ground for A.I. software to spot cancer, as doctors debate whether the technology will replace them in medical jobs.

 Give this article



 701



# Artificial Neural Network for event classification

☰ TIME

TECHNOLOGY

## Google Builds a Brain that Can Search for Cat Videos

Finally, an artificial intelligence breakthrough worth caring about.

By Eliana Dockterman | June 27, 2012

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The Google X laboratory has invented some pretty cool stuff: refrigerators that can order groceries when your food runs low, elevators that can perhaps reach outer space, self-driving cars. So it's no surprise that their most recent design is the most advanced, highest functioning, most awesome invention ever... a computer that likes watching YouTube cats?

Okay, it's a bit more advanced than that. Several years ago, Google scientists began creating a neural network for machine learning. The technique Google X employed for this project is called the "deep



Timothy A. Clary / AFP / Getty Images

# Artificial Neural Network for event classification

**“If Artificial Neural Networks can recognise cats on YouTube videos they should be able to classify nuclear reactions in a TPC”**

By Eliana Dockterman | June 27, 2012



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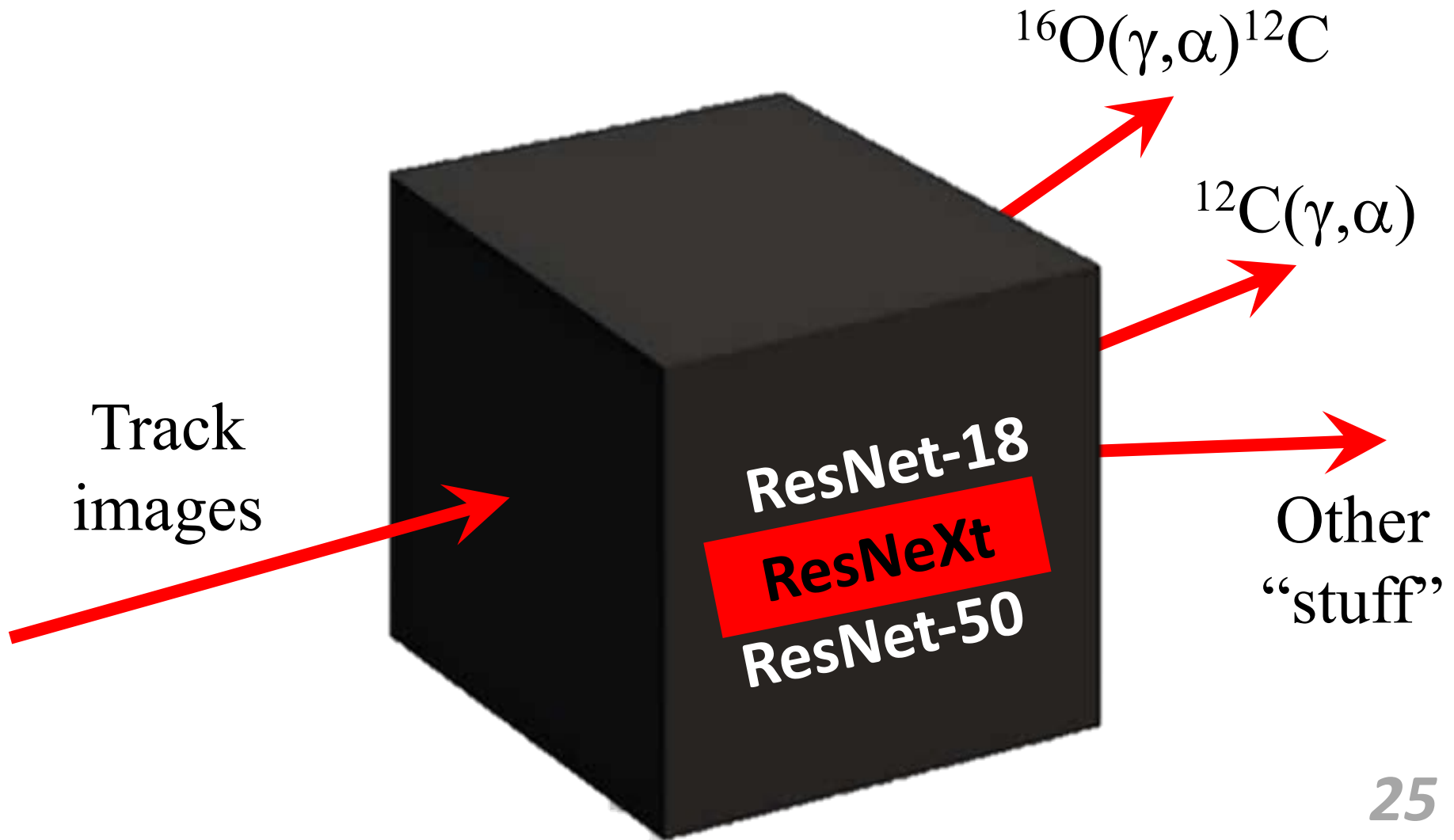
The Google X laboratory has invented some pretty cool stuff: refrigerators that can order groceries when your food runs low, elevators that can perhaps reach outer space, self-driving cars. So it's no surprise that their most recent design is the most advanced, highest functioning, most awesome invention ever... a computer that likes watching YouTube cats?

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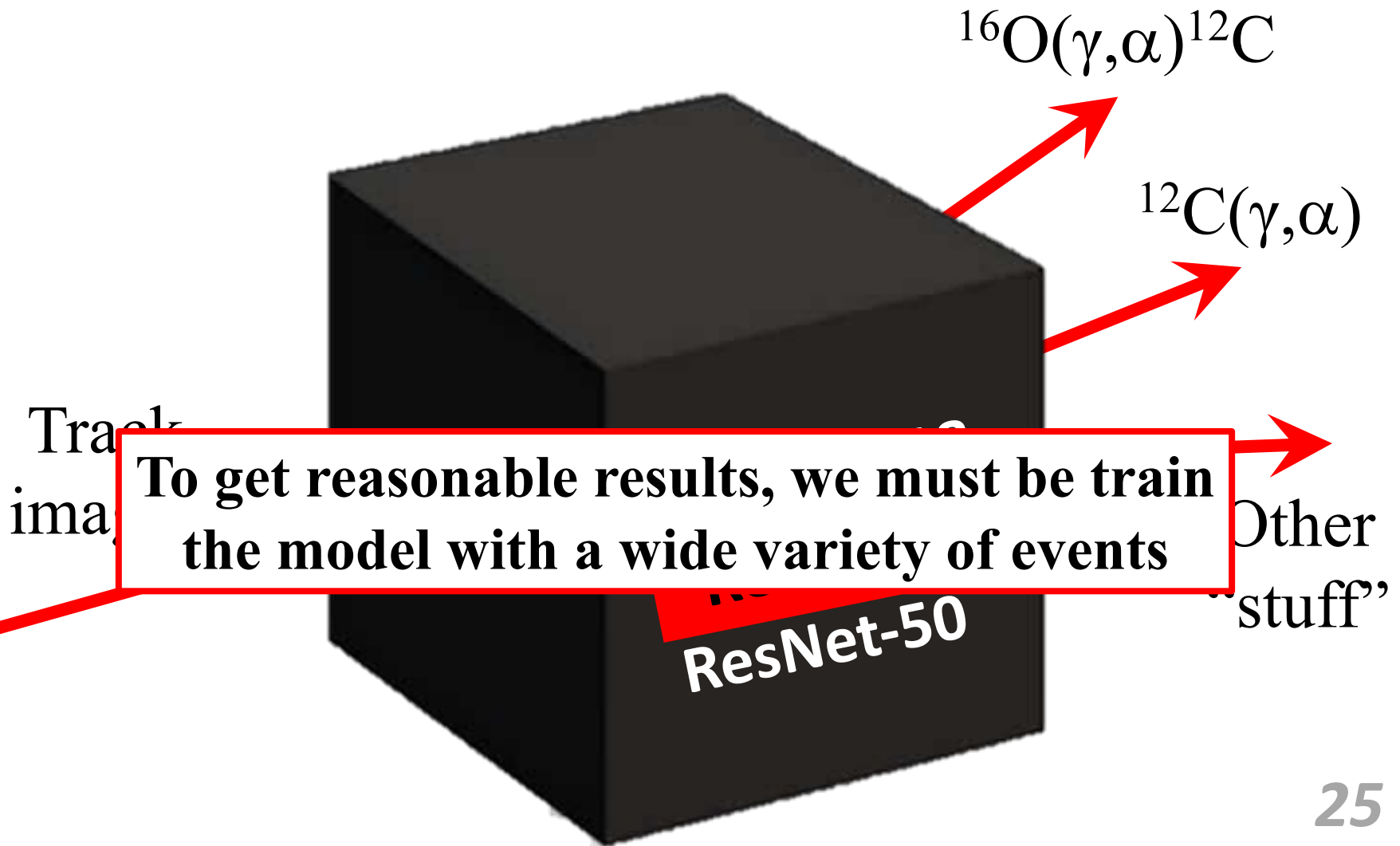
Timothy A. Clary / AFP / Getty Images

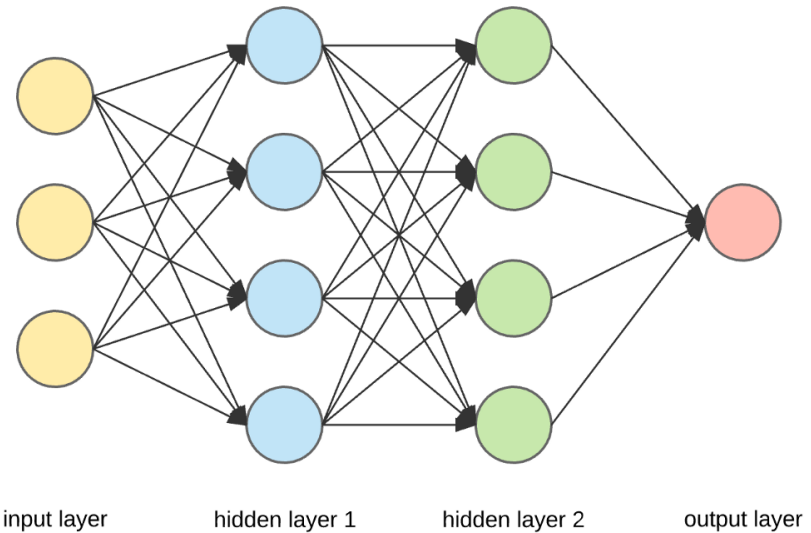
# Artificial Neural Network for event classification





# Artificial Neural Network for event classification

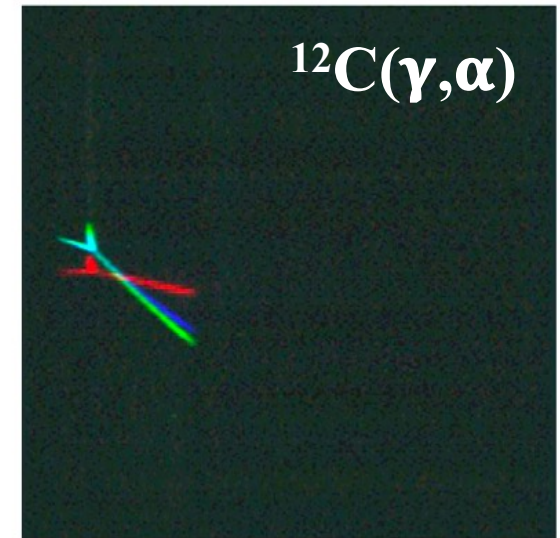
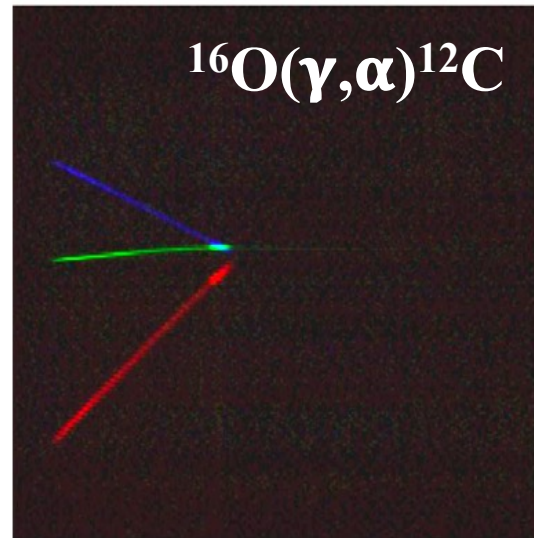
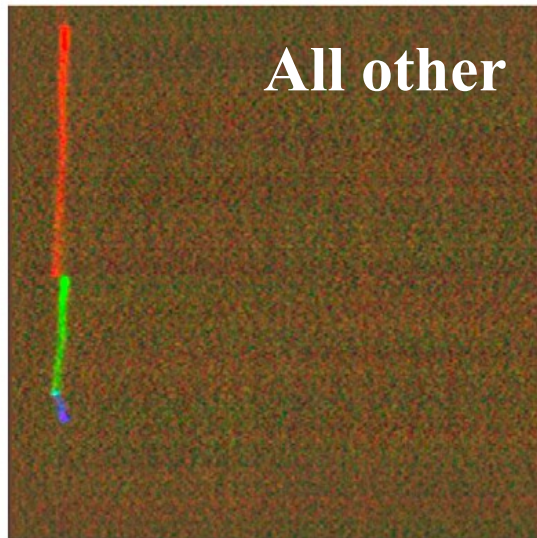




1. Categorise a certain number of events by hand
2. Use these to train the Artificial Neural Networks
3. Categorise larger data set using the model

# Pre-processing tracks

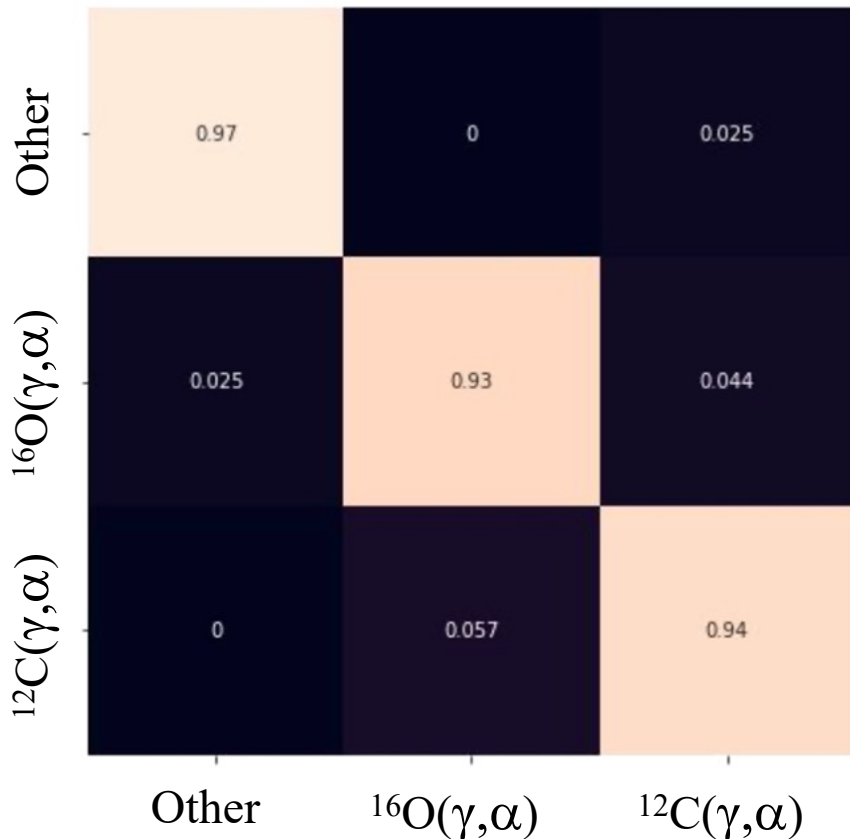
- The hand-categorised data were split into three categories:
- U, V, W projections combined to one image, with RGB channels



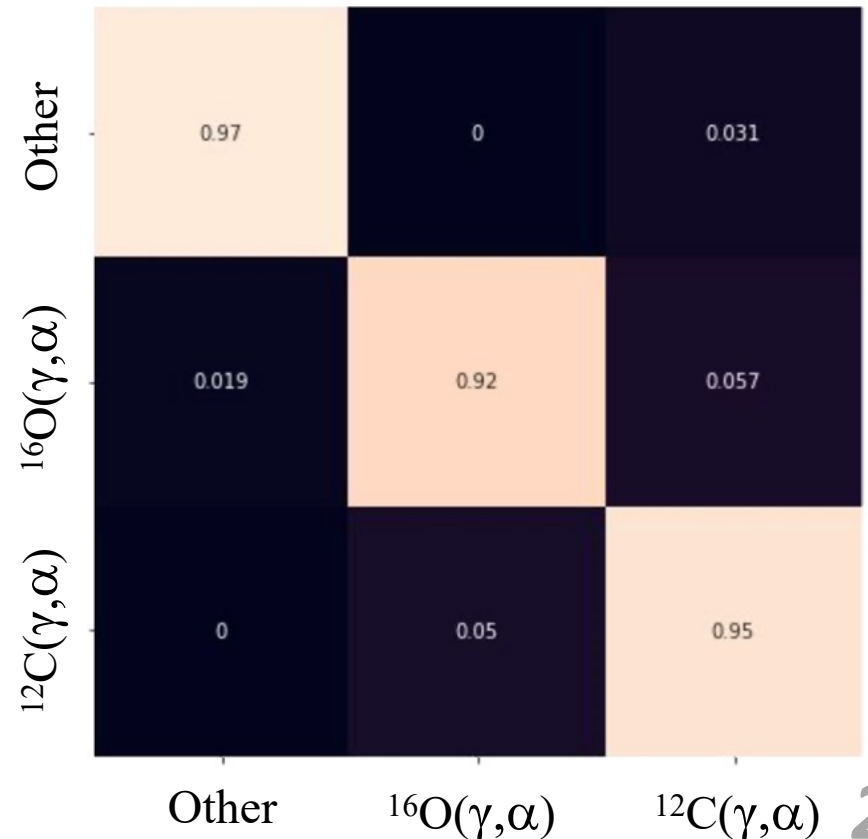
# Performance

- Confusion matrices compare output of testing the network (x-axis) with known classification (y-axis)

ResNet-18



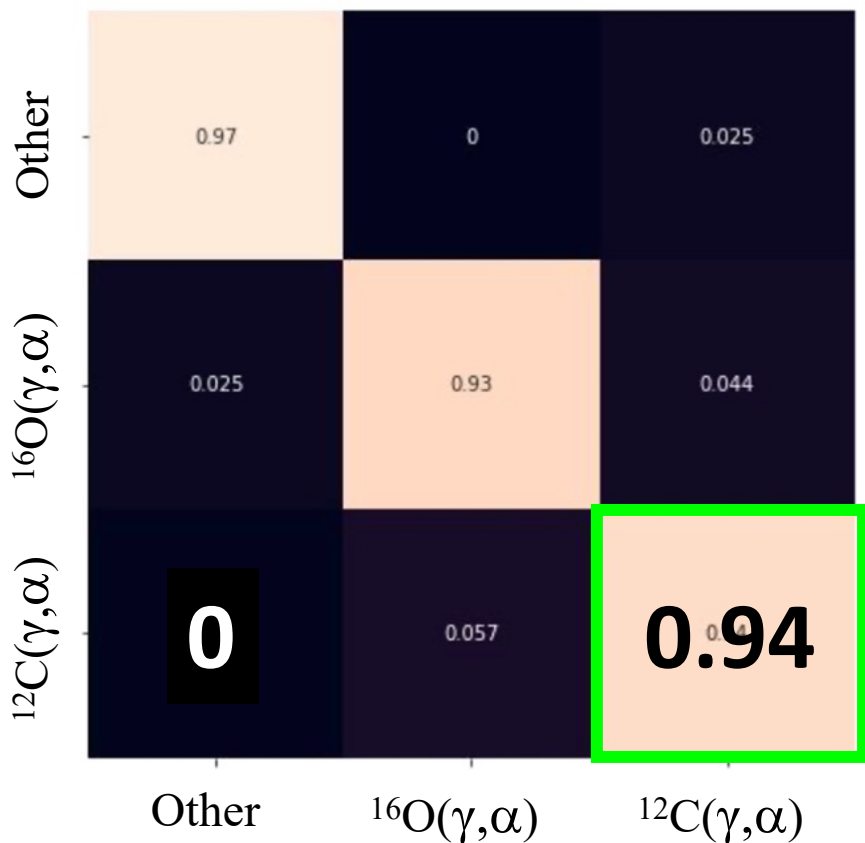
ResNet-50



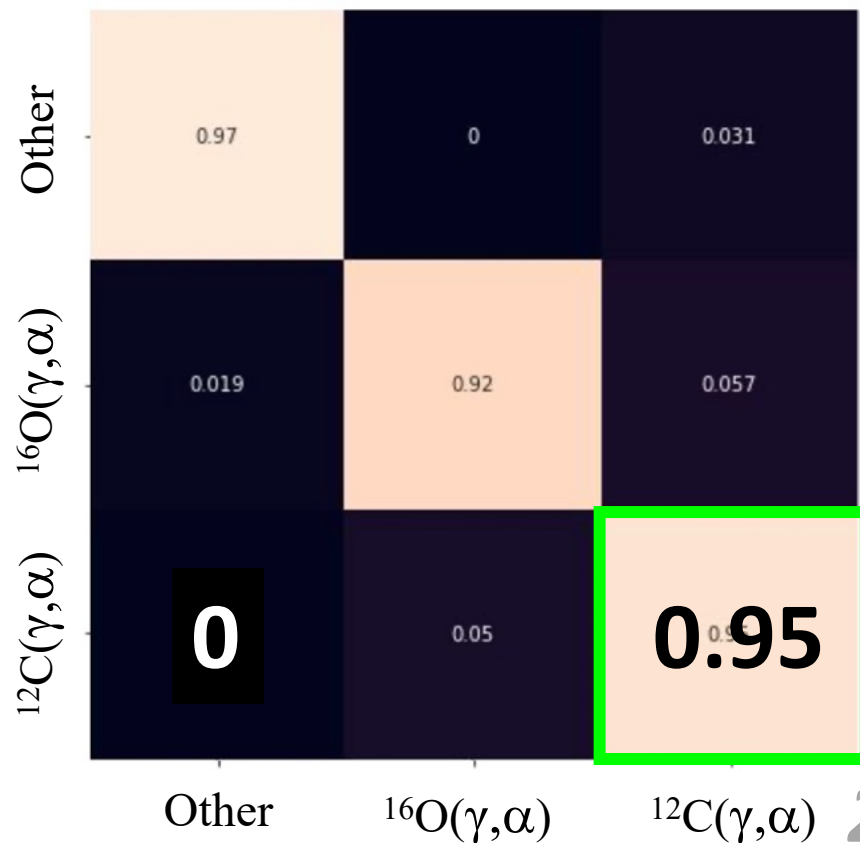
# Performance

- 95% of the  $^{12}\text{C}(\gamma,\alpha)$  were classified correctly
- Hand selection stage still required

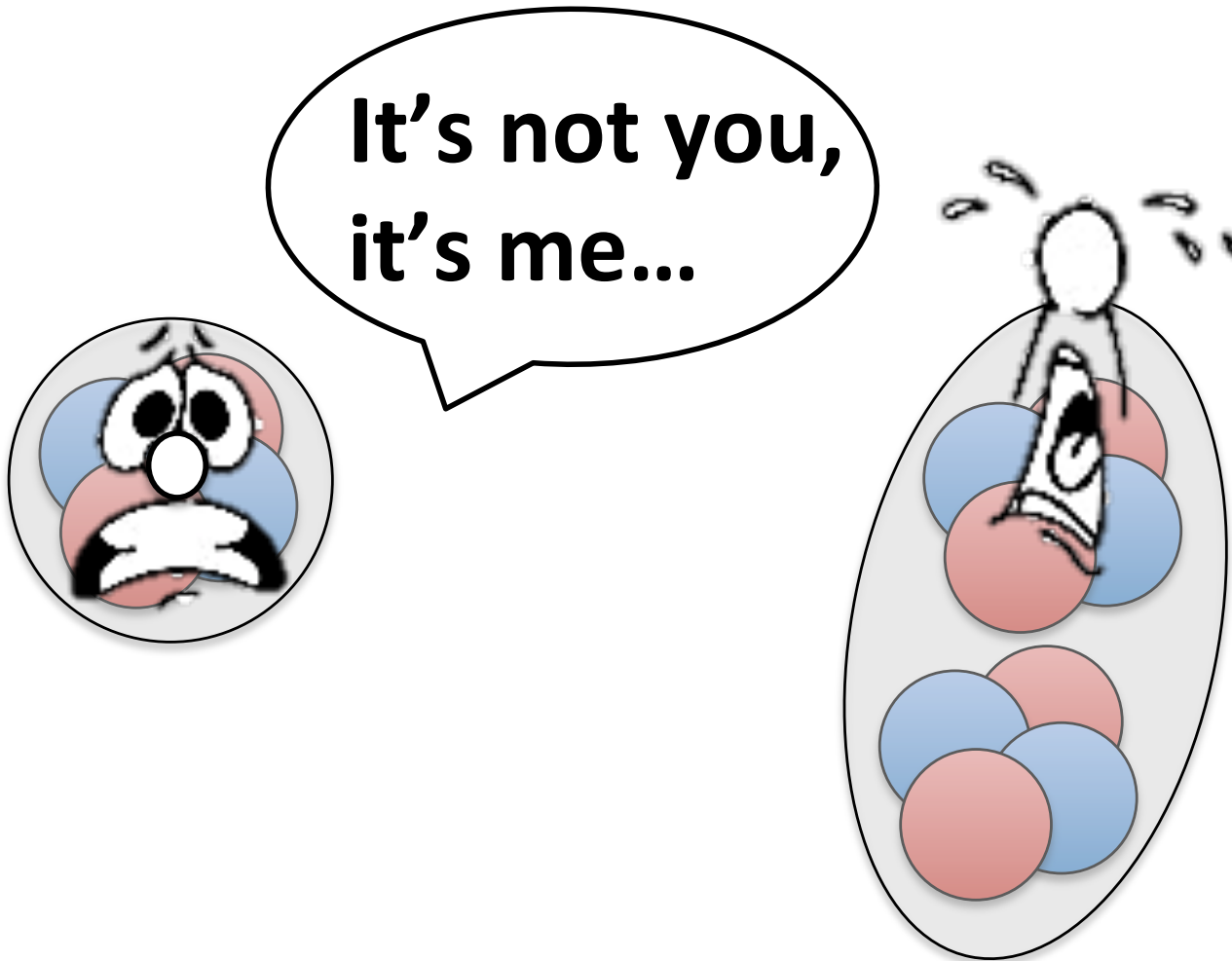
ResNet-18



ResNet-50



# Preliminary results – breakup channels

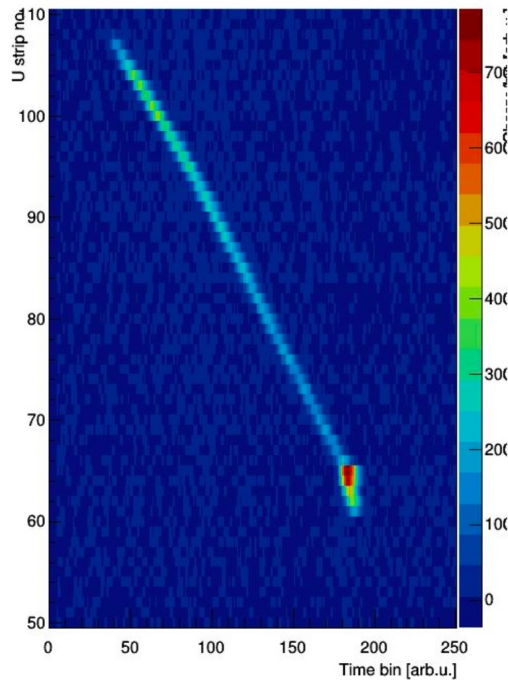


# Preliminary results – $^{12}\text{C}(\gamma,\alpha)^8\text{Be}_{\text{gs}}$

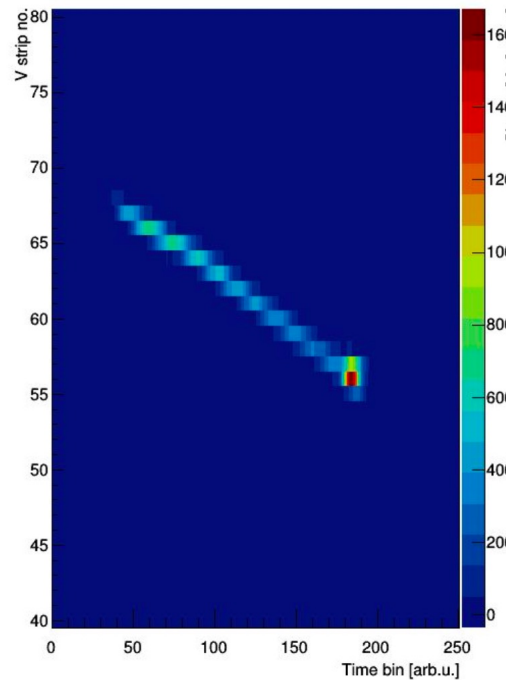
- Angular distribution of longest alpha track plotted

$$W(\theta) = \frac{3}{2} \sin^2 \theta (3|E1|^2 + 25|E2|^2 \cos^2 \theta + 10\sqrt{3}|E1||E2| \cos \phi_{12} \cos \theta)$$

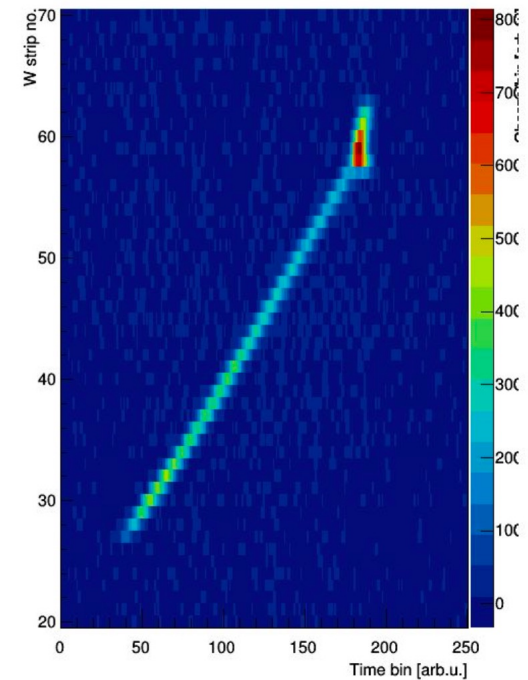
Event-14733: Raw signals from U strips



Event-14733: Raw signals from V strips

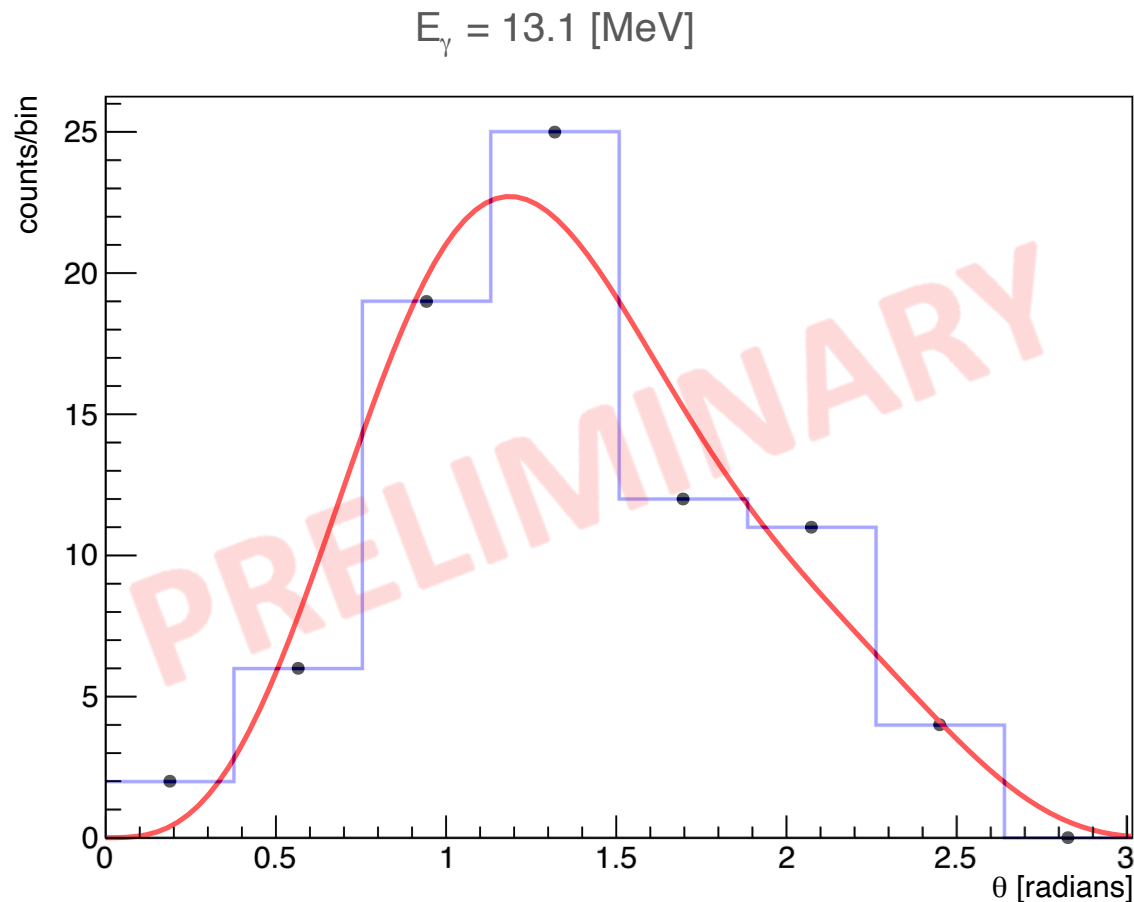


Event-14733: Raw signals from W strips



# Preliminary results – $^{12}\text{C}(\gamma,\alpha)^8\text{Be}_{\text{gs}}$

- Mainly  $1^-$  with some  $2^+$  component

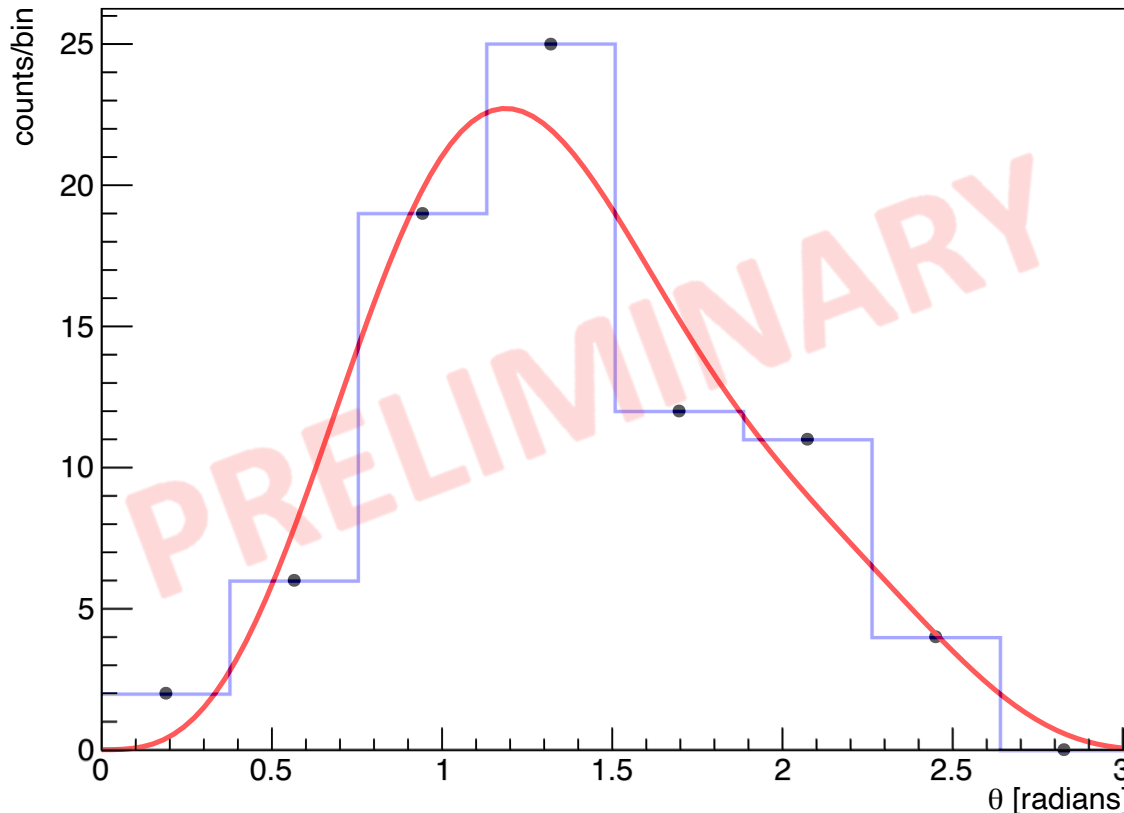




# Preliminary results – $^{12}\text{C}(\gamma,\alpha)^8\text{Be}_{\text{gs}}$

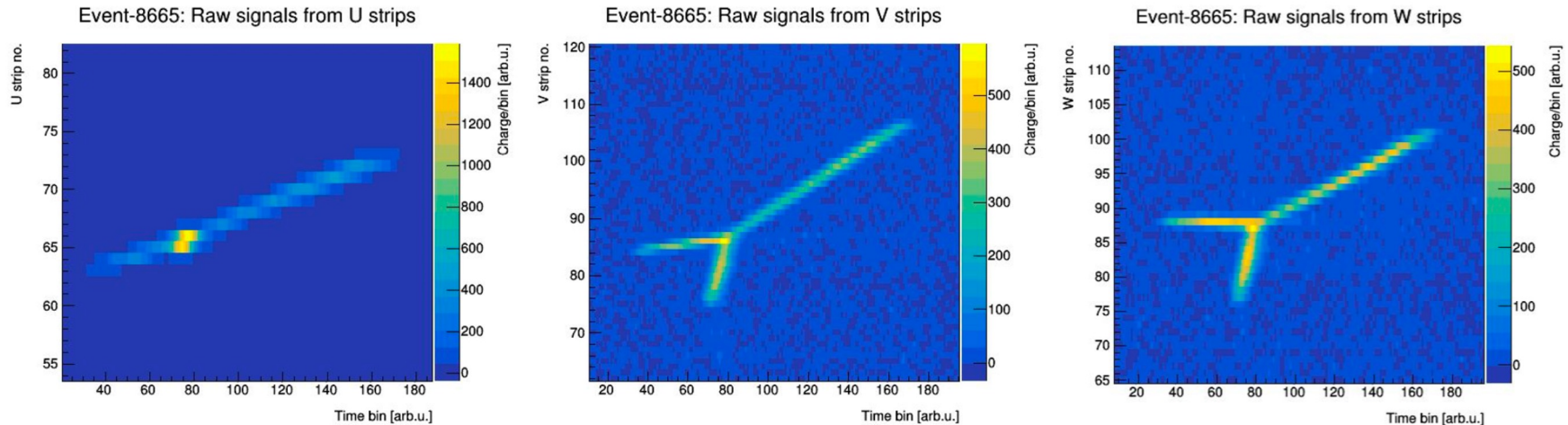
- With higher statistics, search for  $3^-$

$$W(\theta) = \frac{3}{2} \sin^2 \theta \left( |E1|^2 + \frac{25}{4} |E2|^2 \cos^2 \theta + 3\sqrt{3} |E1||E2| \cos \phi_{12} \cos \theta \right. \\ \left. + \frac{7}{2} \sqrt{6} (5 \cos^2 \theta - 1) |E1||E3| \cos \phi_{13} \right)$$



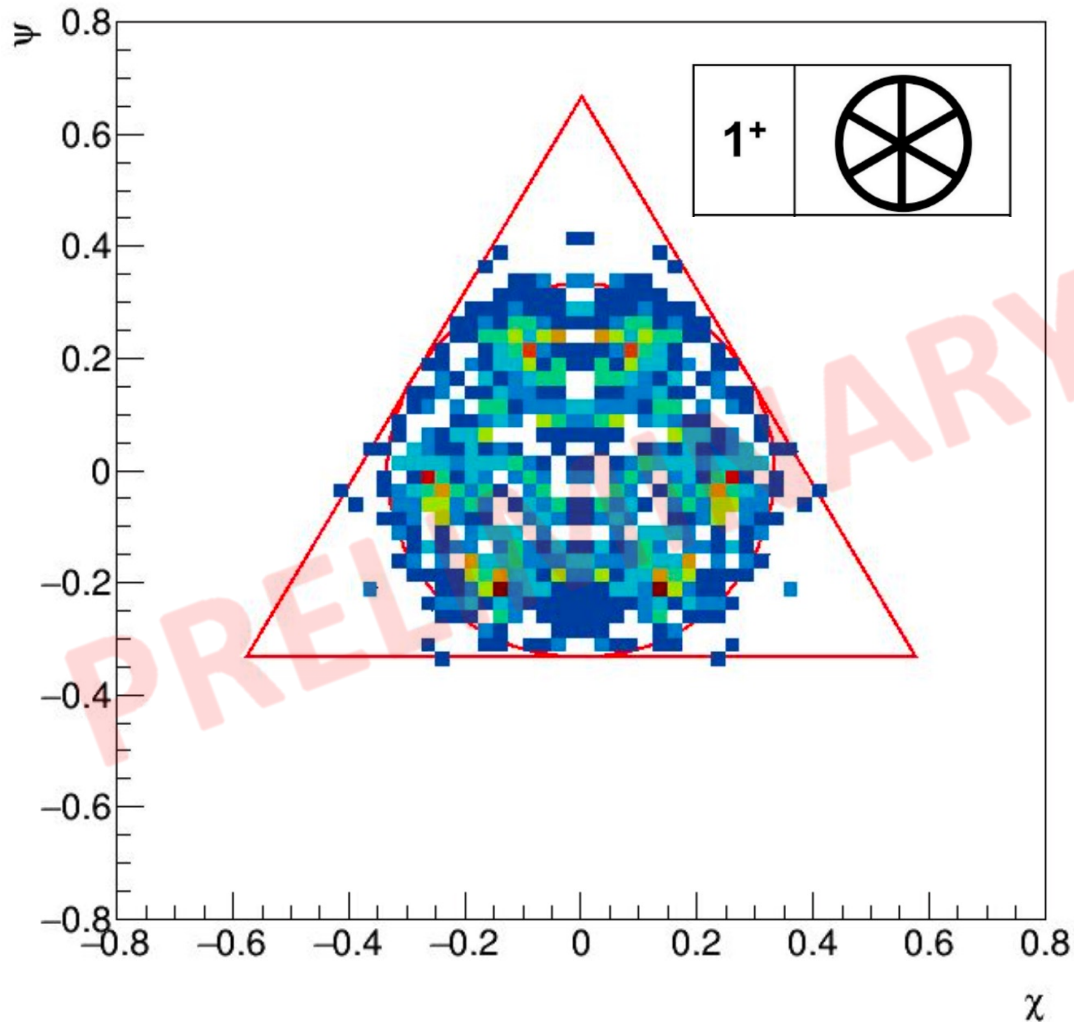
# Preliminary results – $^{12}\text{C}(\gamma, \alpha_1)^8\text{Be}^*$

- Ambiguity over which alpha particle is emitted first
- Must analyse using Dalitz plots



# Preliminary results – $^{12}\text{C}(\gamma, \alpha_1)^8\text{Be}^*$

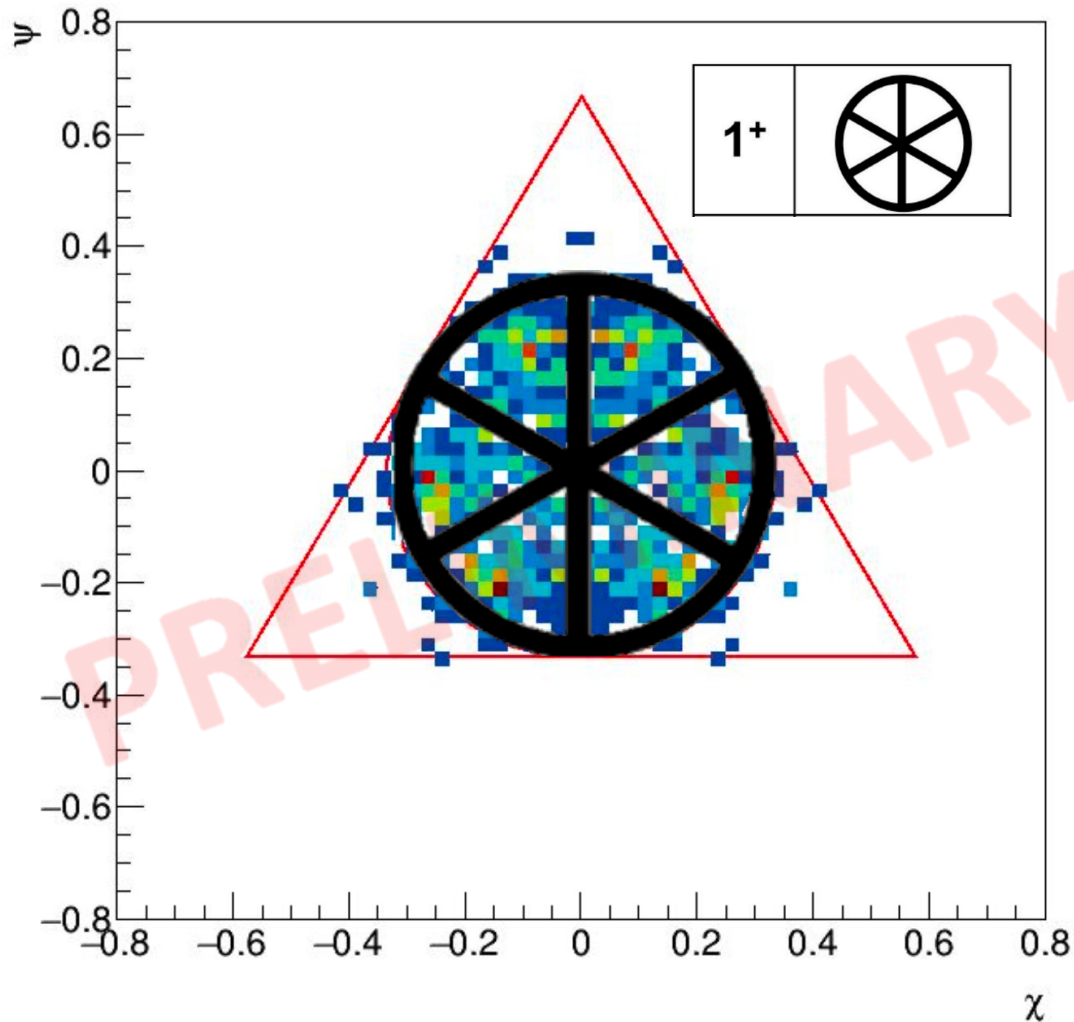
3-prong ( $\alpha_1 + \alpha_2 + \alpha_3$ ) - Dalitz plot



$0^+$			
$1^-$		$1^+$	
$2^+$		$2^-$	
$3^-$		$3^+$	

# Preliminary results – $^{12}\text{C}(\gamma, \alpha_1)^8\text{Be}^*$

3-prong ( $\alpha_1 + \alpha_2 + \alpha_3$ ) - Dalitz plot



$0^+$			
$1^-$		$1^+$	
$2^+$		$2^-$	
$3^-$		$3^+$	

# Summary

- Warsaw TPC used to study clustering in  $^{12}\text{C}$
- Gamma beams + TPC offer low backgrounds, high selectivity,  $2^\circ$  angular resolution
- ResNet-18 and -50 Neural Networks used for event classification
- Initial evidence of  $1^+$ ,  $1^-$  and  $2^+$  strength at 13.1 MeV in  $^{12}\text{C}$
- With higher statistics, further work needed to include E3 to angular distributions

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