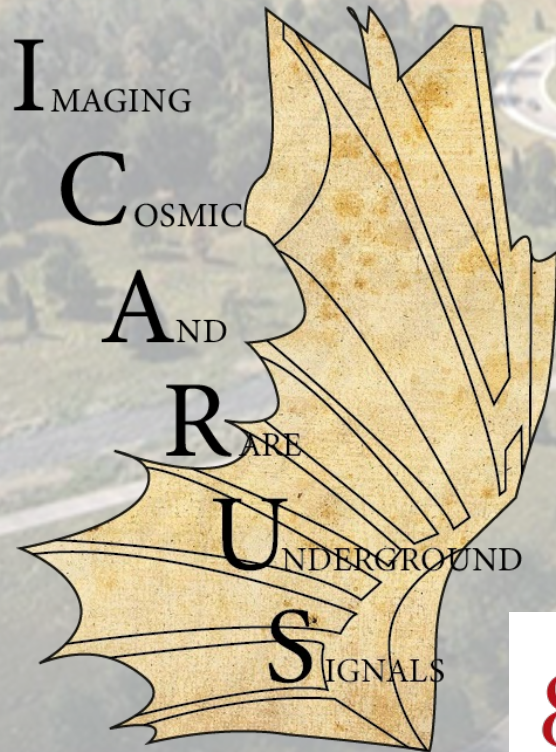


# Towards a neutrino analysis in the ICARUS detector

Fermilab 2024 Summer Students School

Maria Artero Pons

24<sup>th</sup> July 2024



UNIVERSITÀ  
DEGLI STUDI  
DI PADOVA

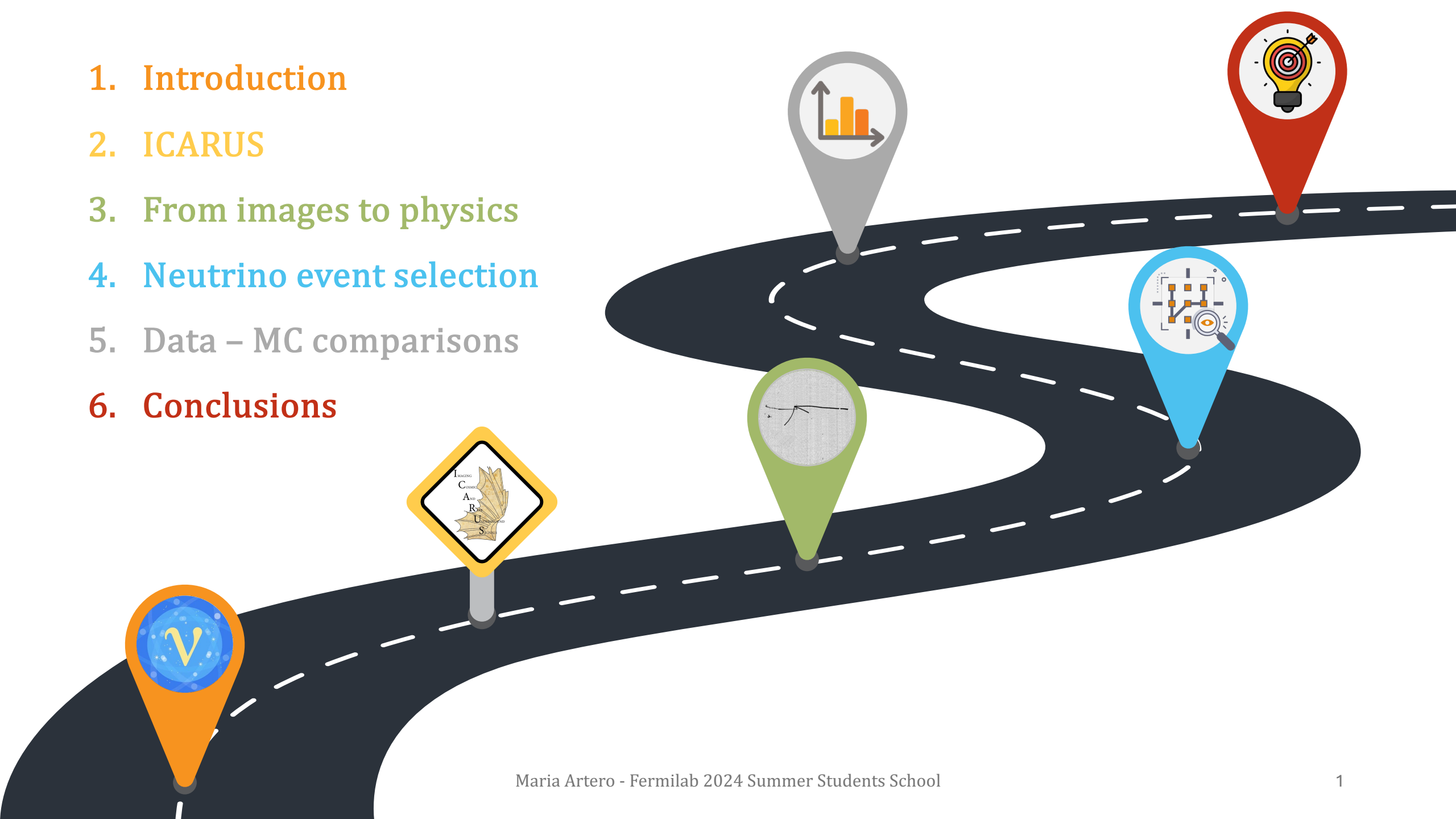


Dipartimento  
di Fisica  
e Astronomia  
Galileo Galilei

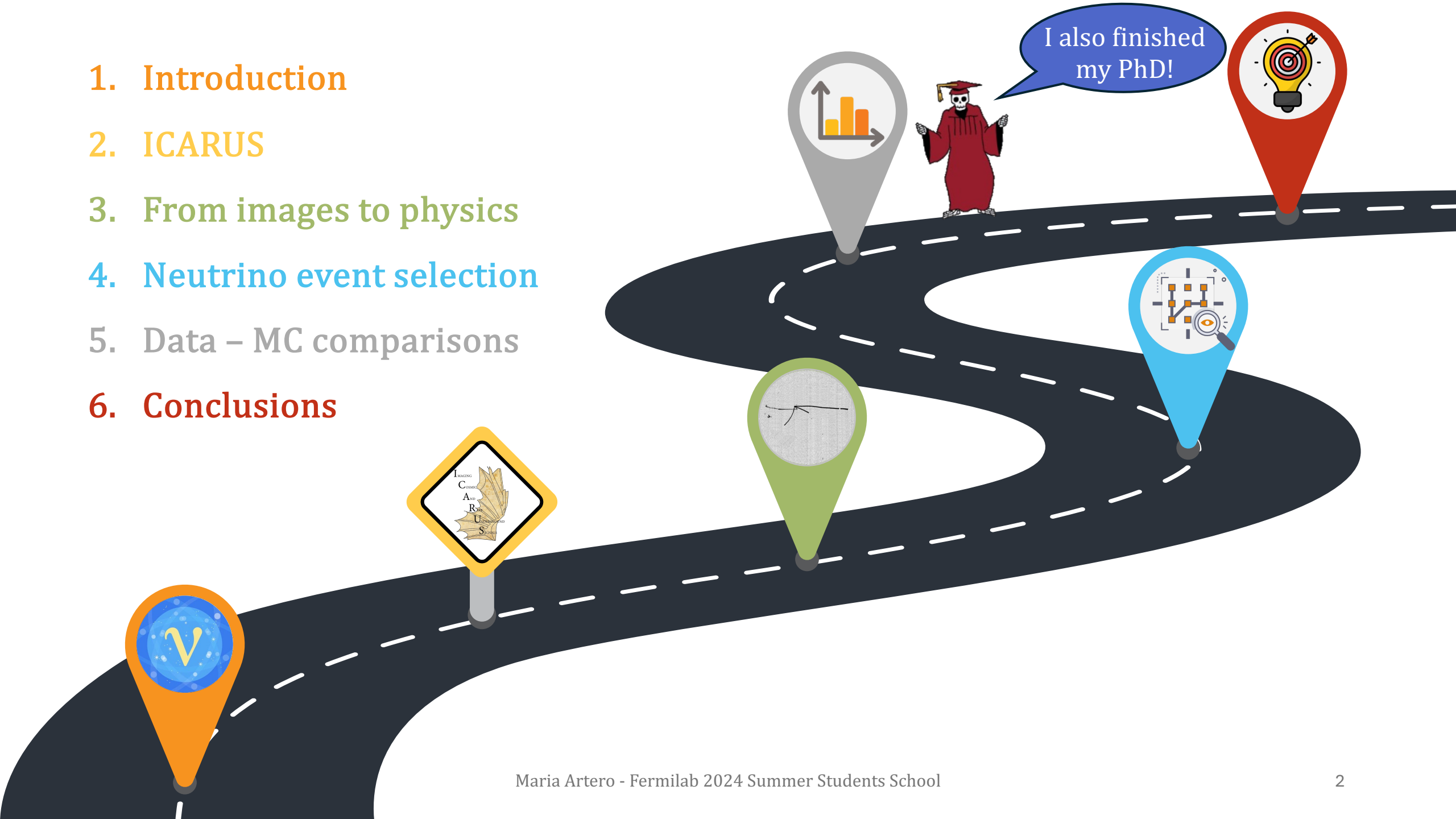


H2020-MSCA-RISE-2018  
G.A. 822185

1. Introduction
2. ICARUS
3. From images to physics
4. Neutrino event selection
5. Data – MC comparisons
6. Conclusions

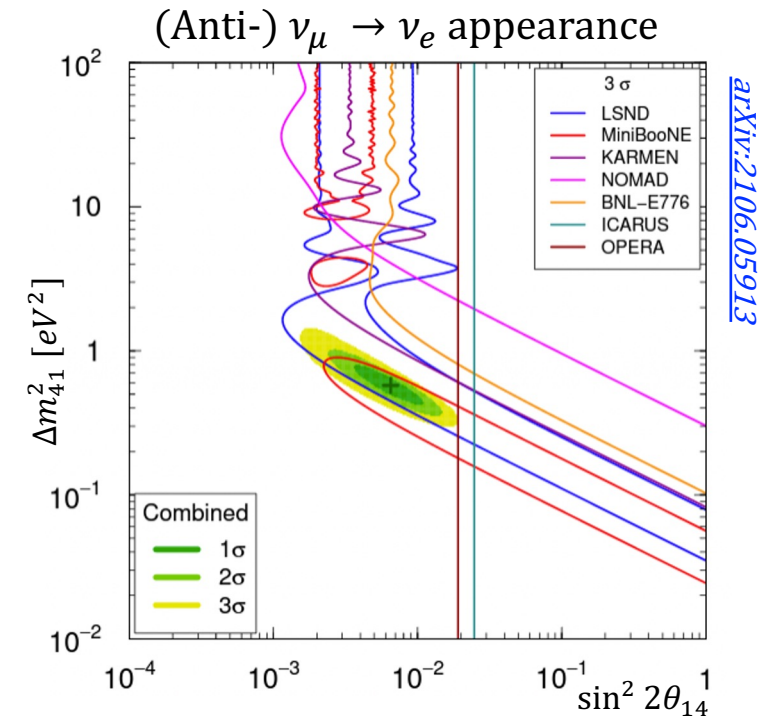
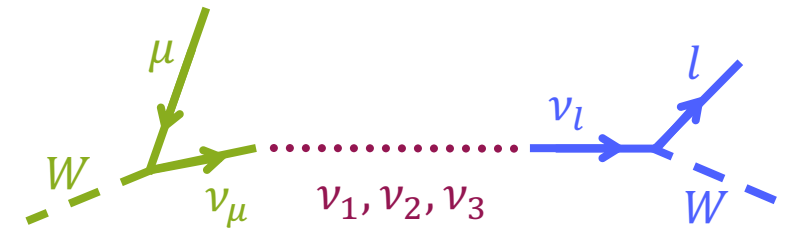


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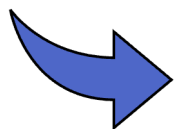
# Neutrino oscillations

- Neutrinos are produced and detected as well-defined **flavour** eigenstate, however they propagate via **mass** eigenstates
- Despite the well-established 3 flavour  $\nu$  mixing picture, several anomalies from accelerator experiments (LSND and MiniBooNE), reactor and radioactive sources have been reported in the last 20 years, unable to fit inside the scheme
- Results suggest a new *sterile*  $\nu$  flavour at  $\Delta m^2 \sim eV^2$  and small mixing angle, thus driving short distance oscillations

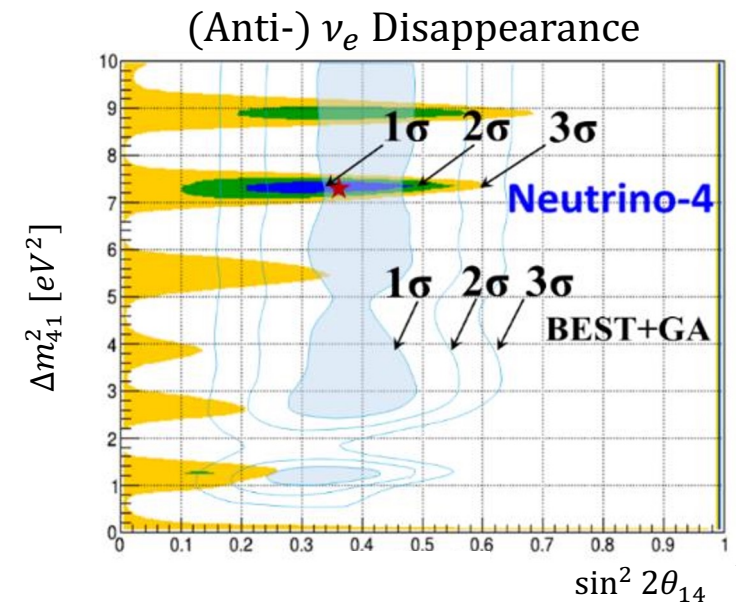


# The sterile neutrino puzzle

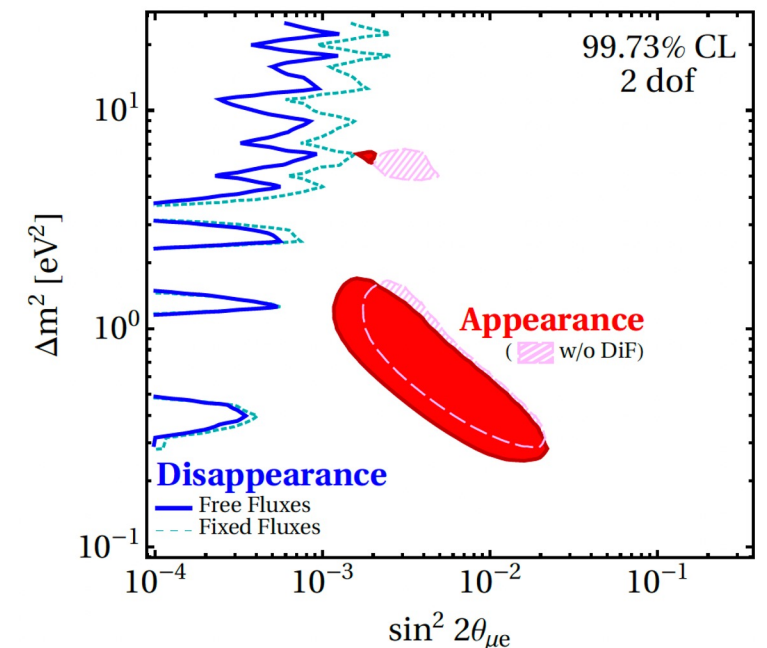
- The Neutrino-4 collaboration reported a hint of oscillation signature at higher mass splitting [arXiv:2005.05301](https://arxiv.org/abs/2005.05301)
  - Reactor  $\bar{\nu}_e$  disappearance with  $\Delta m^2 \sim 7 \text{ eV}^2$  and  $\sin^2 2\theta \sim 0.26$
  - Combining Neutrino-4 results with data from GALLEX, SAGE, and BEST experiments the confidence in previously claimed results has increased to  $5.8\sigma$  CL [arXiv:2302.09958](https://arxiv.org/abs/2302.09958)
- Clear tension between appearance and disappearance results is observed in global constraint plots



Measuring both channels with the same experiment will help clarify the scenario

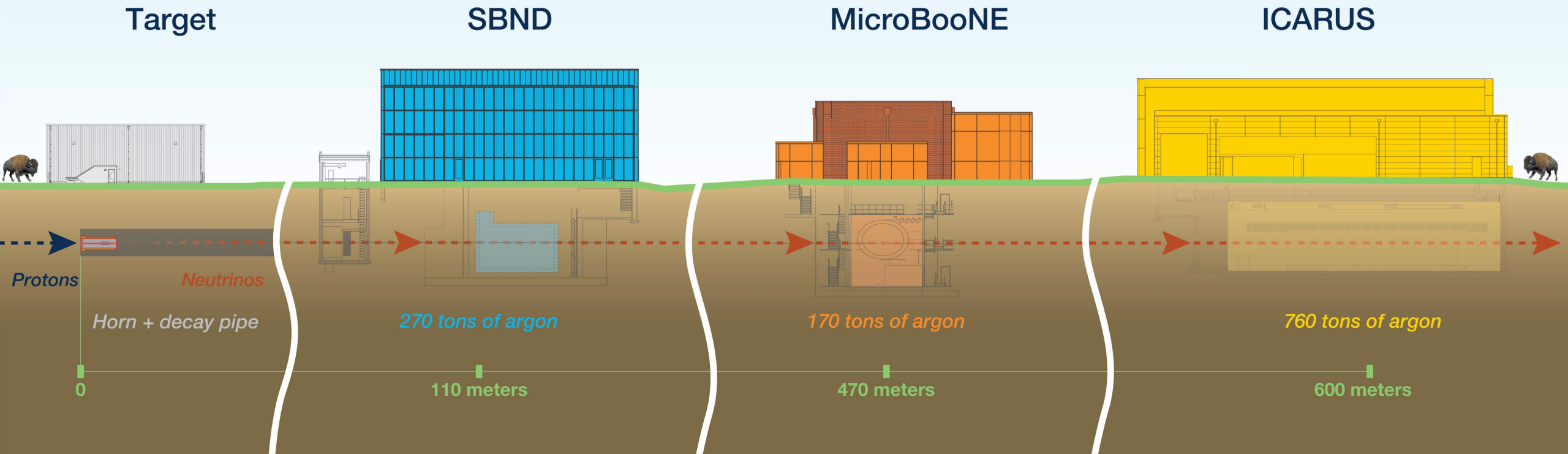


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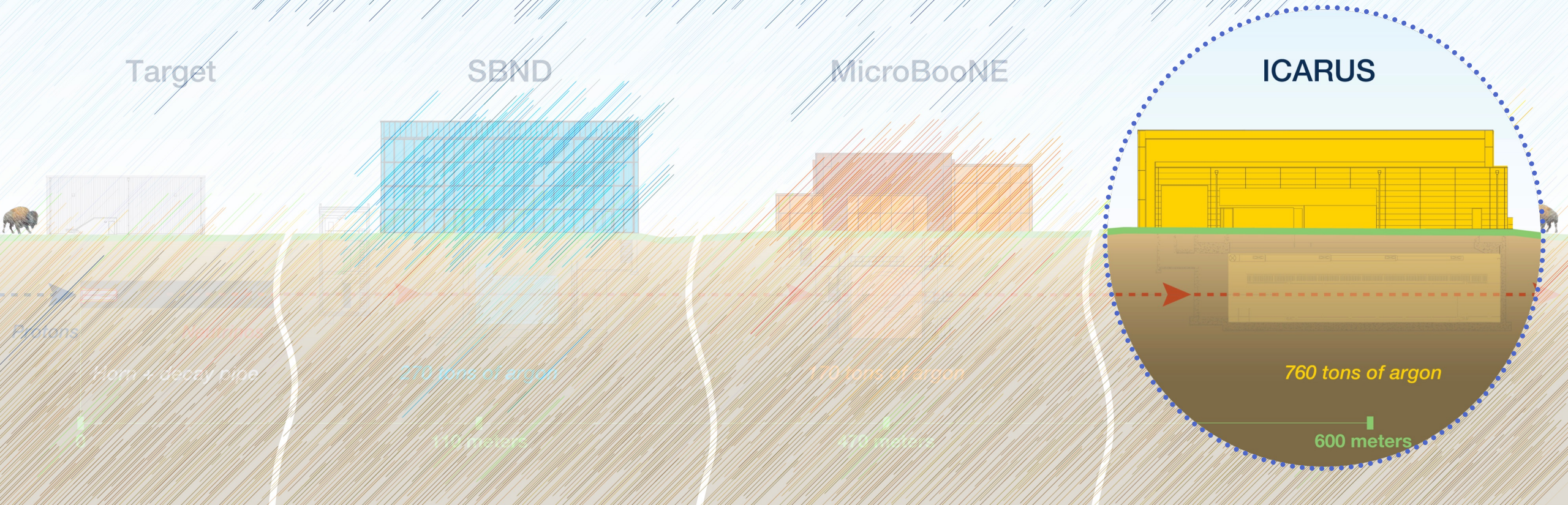
[HEP08 \(2018\) 010](https://arxiv.org/abs/1808.010)

# Short-Baseline Neutrino Program at Fermilab



- Short Baseline Neutrino (SBN) Program main goal is to search for sterile neutrino oscillations both in appearance and disappearance channels (at  $\sim eV^2$  mass scale)
- 3 Liquid Argon Time Projection Chambers (LArTPC) sampling the same Booster Neutrino Beam (BNB) at different distances

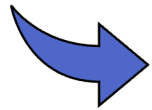
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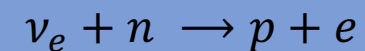
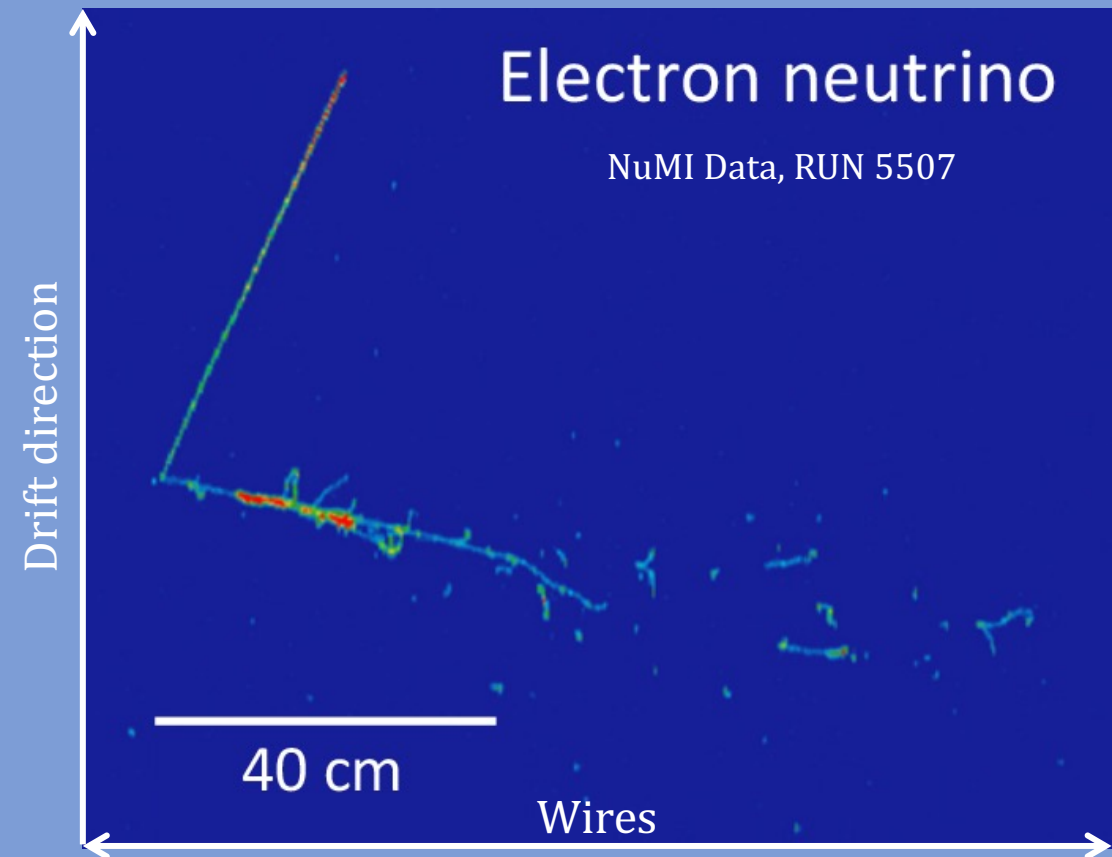
# From images to physics

- LArTPC detectors produce high resolution images of particle interactions



Need to reconstruct these interactions from raw images to perform high level analysis

- An important piece in the reconstruction process is the pattern recognition algorithm which must:
  - Identify the individual particles and their relationship to each other
  - Arrange these particles into production hierarchies
  - Determine their 3D trajectories

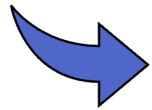


Electron neutrino interaction that produced a proton (1) and an electron. The later produced an EM shower with photons and electrons (2)



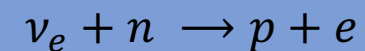
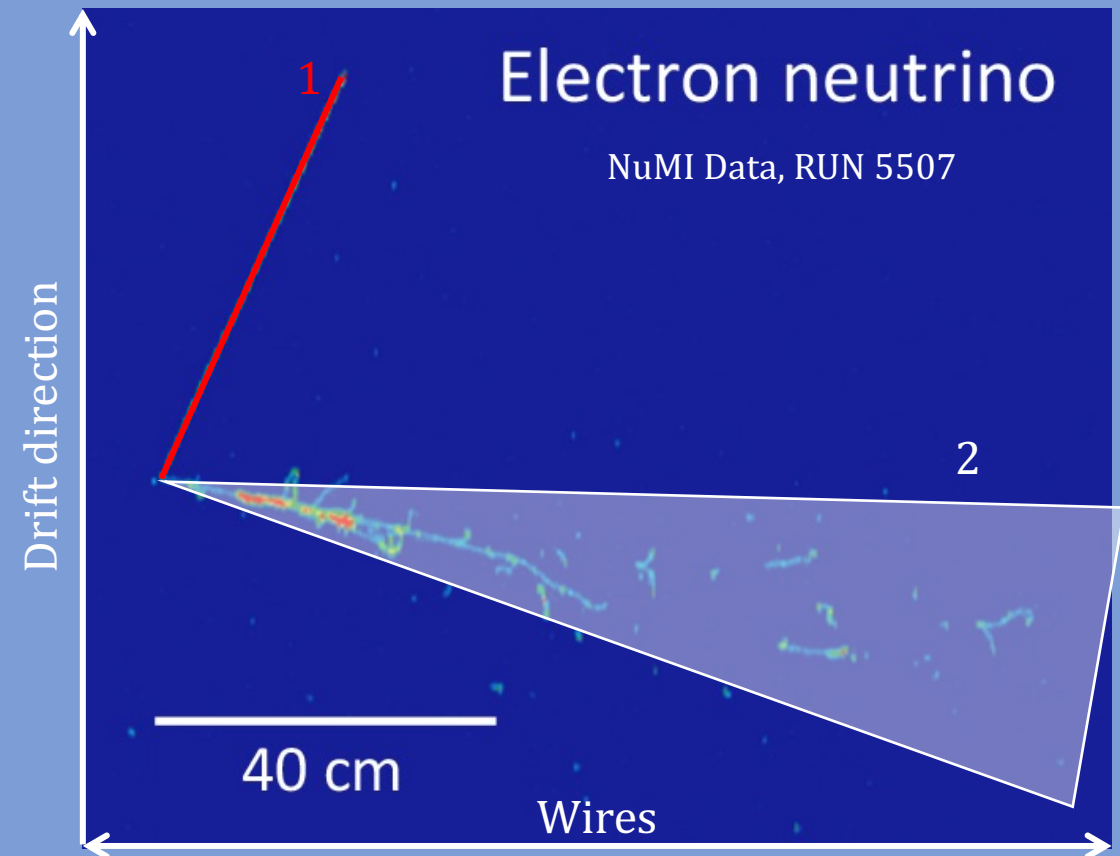
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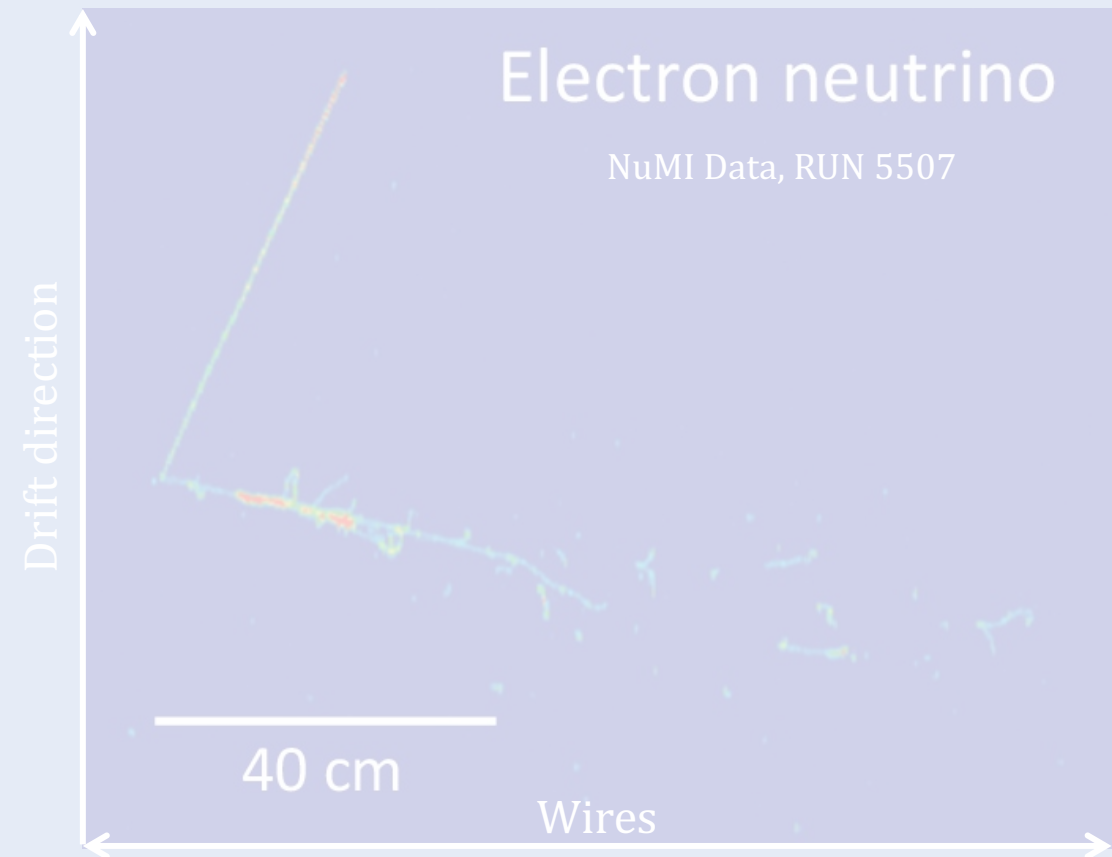
# From images to physics

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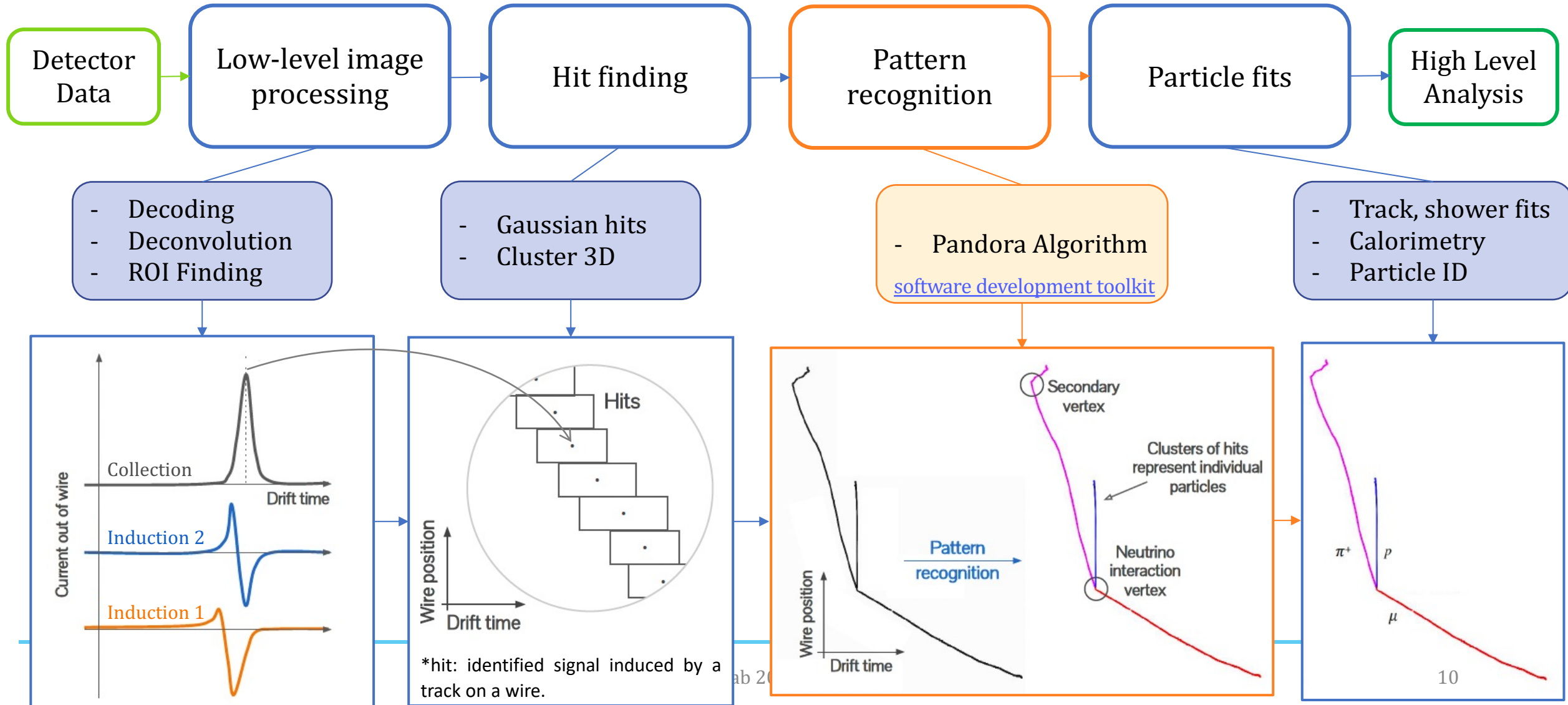
Due to the large amount of data to analyse, an automated solution is mandatory

- An important step in the analysis process is the pattern recognition
  - Identify particles and their relationship to each other
  - Arrange these particles into production hierarchies
  - Determine their 3D trajectories



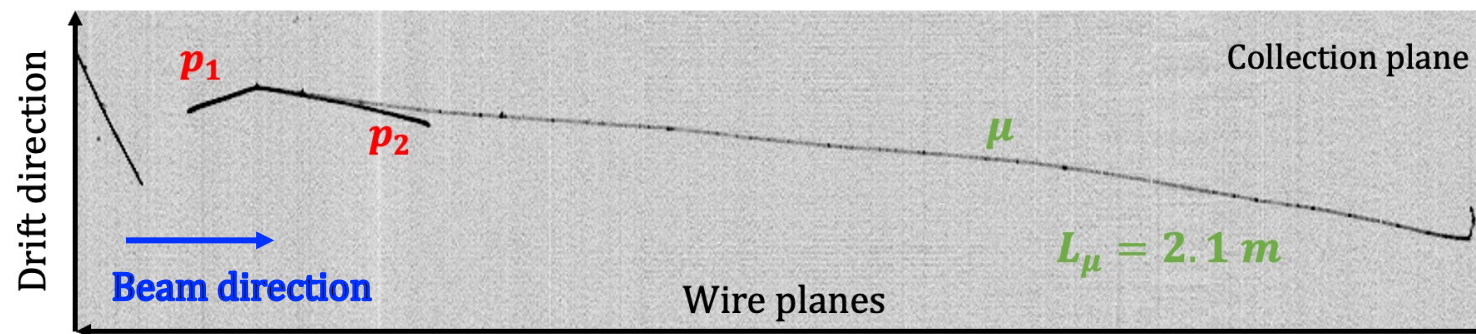
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# The reconstruction pipeline



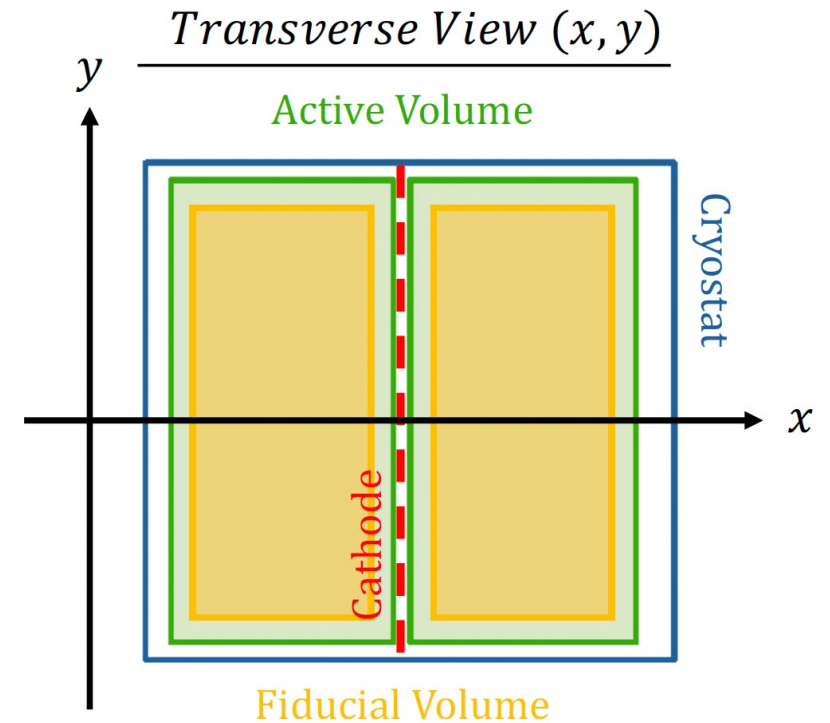
# Ongoing physics analysis

- While the near detector is getting ready to join the SBN program, ICARUS-standalone phase is addressed to test the Neutrino-4 oscillation hypothesis in the same L/E range ( $\sim 1-3$  m/MeV), but collecting  $\sim \times 100$  more energetic events
  - $\nu_e$  disappearance channel from NuMI: selecting contained EM showers from quasi-elastic  $\nu_e$  CC interactions
  - $\nu_\mu$  disappearance channel from BNB: focusing on contained quasi-elastic  $\nu_\mu$  CC interactions
- BNB studies are performed on  $\nu_\mu$  CC fully contained events with a single muon and at least a proton in the final state



# Neutrino event selection

- A first step towards this goal is to select events which:
  1.  $\nu$  vertex should be inside the **fiducial volume** i.e., 25 cm apart from the lateral TPC walls and 30/50 cm from the upstream/downstream walls
  2. **Fully contained** interactions i.e., no signal in the last 5 cm of the LAr **active volume**
  3. Stopping muon of  $L_\mu > 50$  cm
- To further simplify, consider **1 $\mu$ 1p** candidates
  4. Only 1 proton  $L_p > 1$  cm produced at the primary vertex



# $1\mu 1p$ visually selected events

- Performance validation of the available automatic reconstruction tools
  - Sample of 520  $1\mu 1p$  visually selected data events
- For each event, the 3D position of the vertex, end muon and end proton were saved
  - Comparison between manually and automatically reconstructed variables
- Stringent quality requirements were defined to
  - assess Pandora's reconstruction algorithm
  - identify a set of well reconstructed  $1\mu 1p$  events

Quality cuts	Selected events
Total events	520 - 100%
1. Well reconstructed vertex	405 - 78%
2. Primary muon track and of $L_\mu > 50$ cm	400 - 77%
3. Well reconstructed start muon	353 - 68%
4. Well reconstructed end muon	247 - 48%
5. Correct identification of muon	246 - 47%
6. Proton track candidate	183 - 35%
7. Correct identification of proton	120 - 23%

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Automatically selected and well reconstructed events

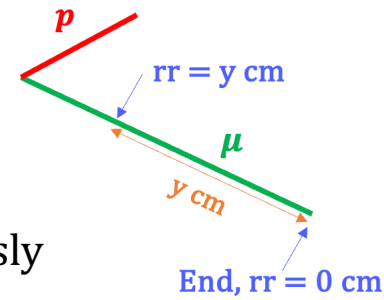
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# Particle identification

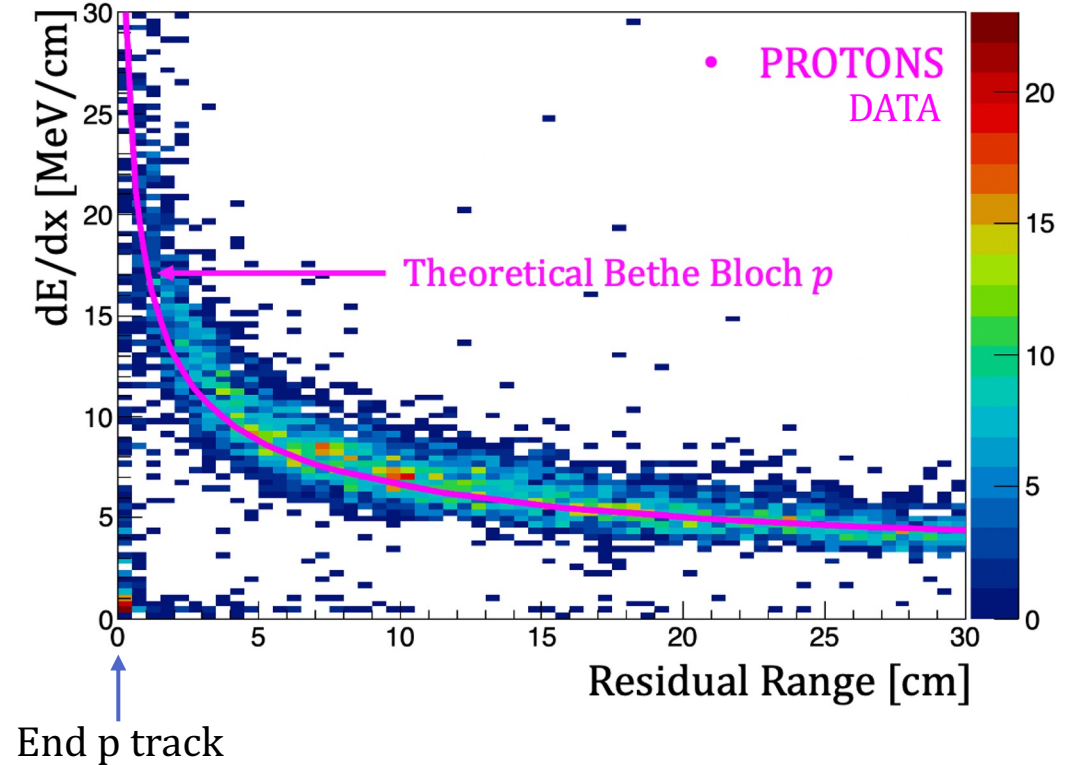
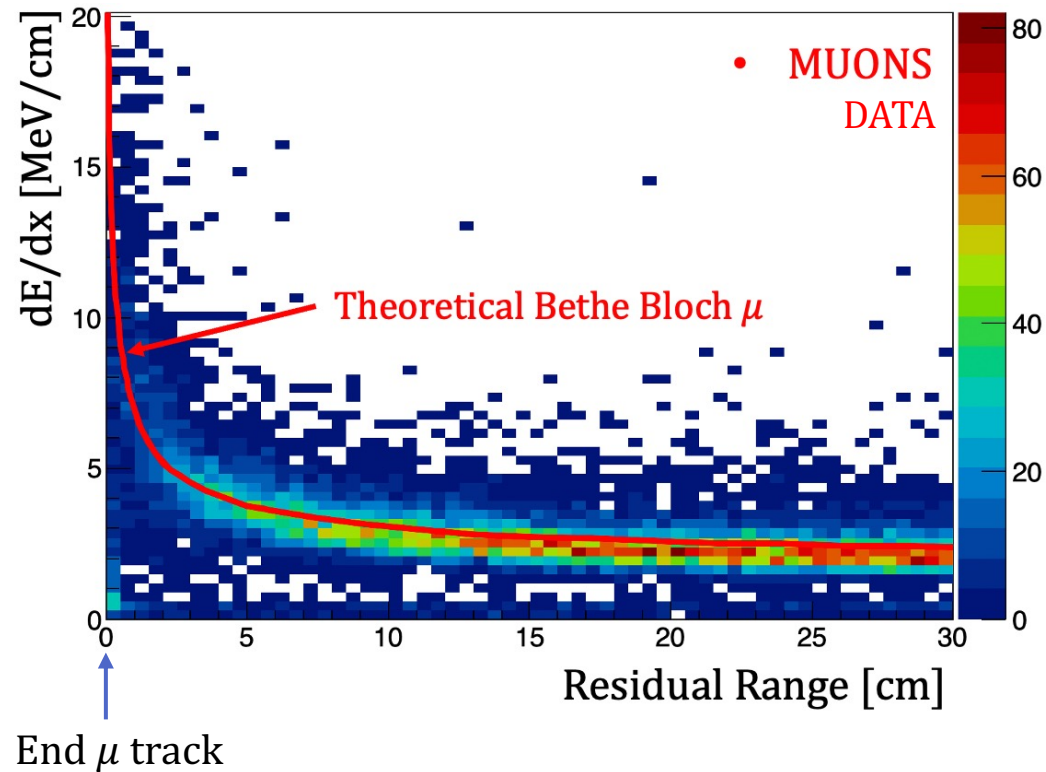
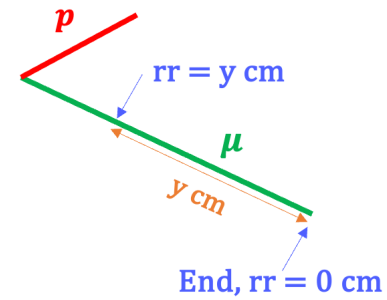


- The identification of  $1\mu 1p \nu$  interactions requires a Particle Identification (PID) tool to unambiguously recognize stopping muons and protons
- The current algorithm relies on the comparison between the measured  $dE/dx$  vs residual range along the track and the mean theoretical profiles from different particles ( $\mu, p, K, \pi$ )
- The PID defines  $\chi_k^2(j)$  score computed in the last **25 cm** of each track for all wire planes

↪  $\chi_k^2(j)$  :  $\chi^2$  score for particle  $j$  under the hypothesis of being a  $k$ -particle

# Particle identification

- Sample of well reconstructed data events together with their theoretical predictions



# Neutrino transverse momentum

- **Well reconstructed** events are selected and the  $\mu$  and  $p$  momenta computed from their range
- Kinematic event reconstruction is validated through the total transverse momentum
- The transverse momentum of genuine  $\nu_\mu CCQE$  events  $\rightsquigarrow$  dominated by the Fermi momentum in Ar nuclei

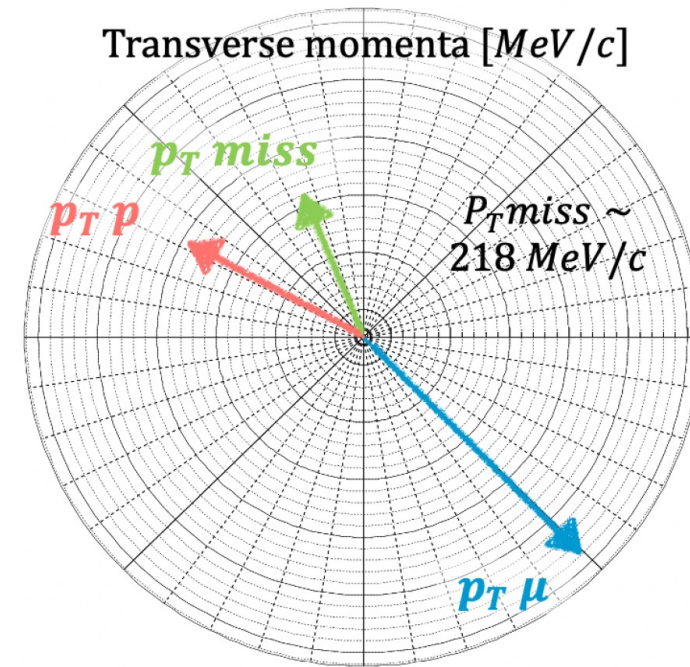
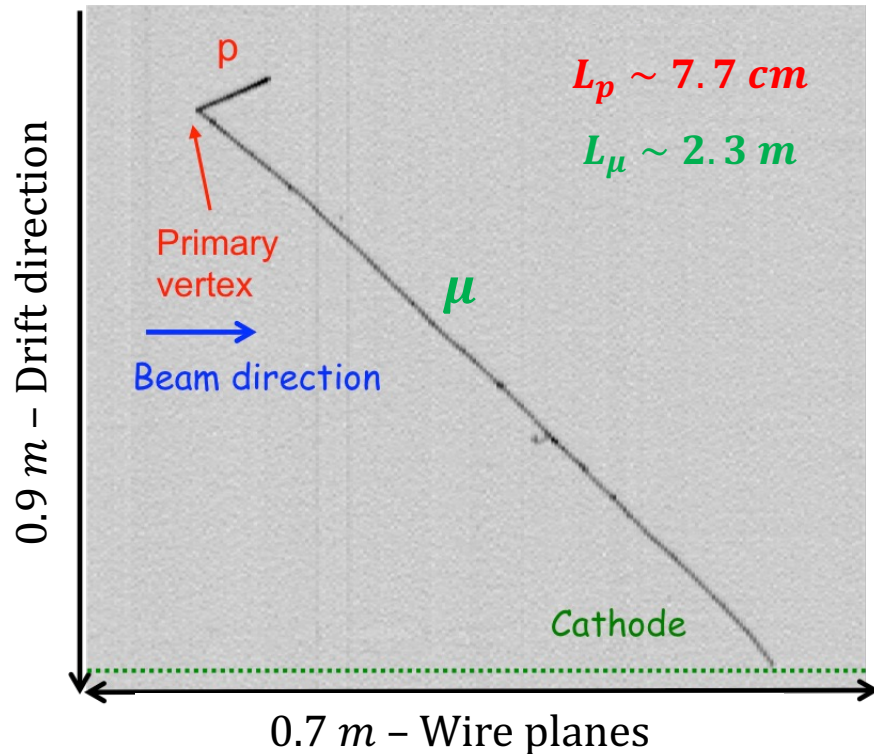
( $p_F \leq 250$  MeV/c)



Transverse kinematic variables encode information of initial nuclear state and final state interactions  
Can be used as a proxy for the event interpretation and energy resolution

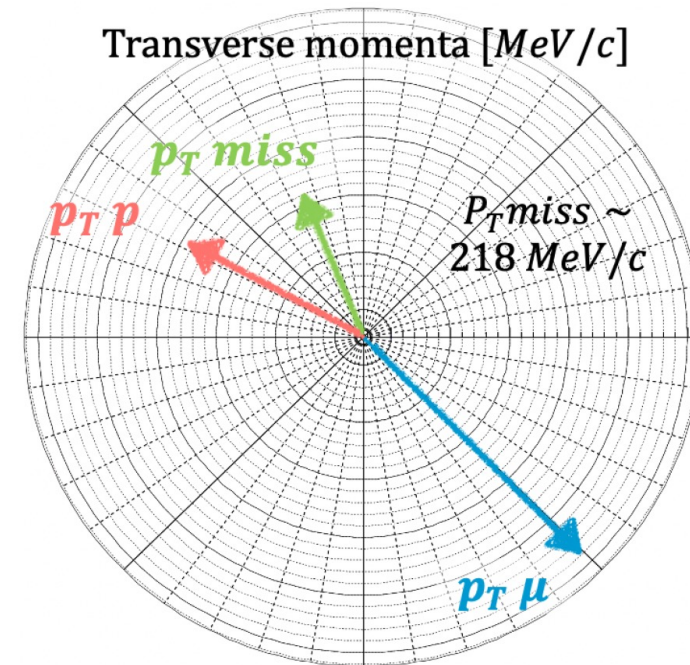
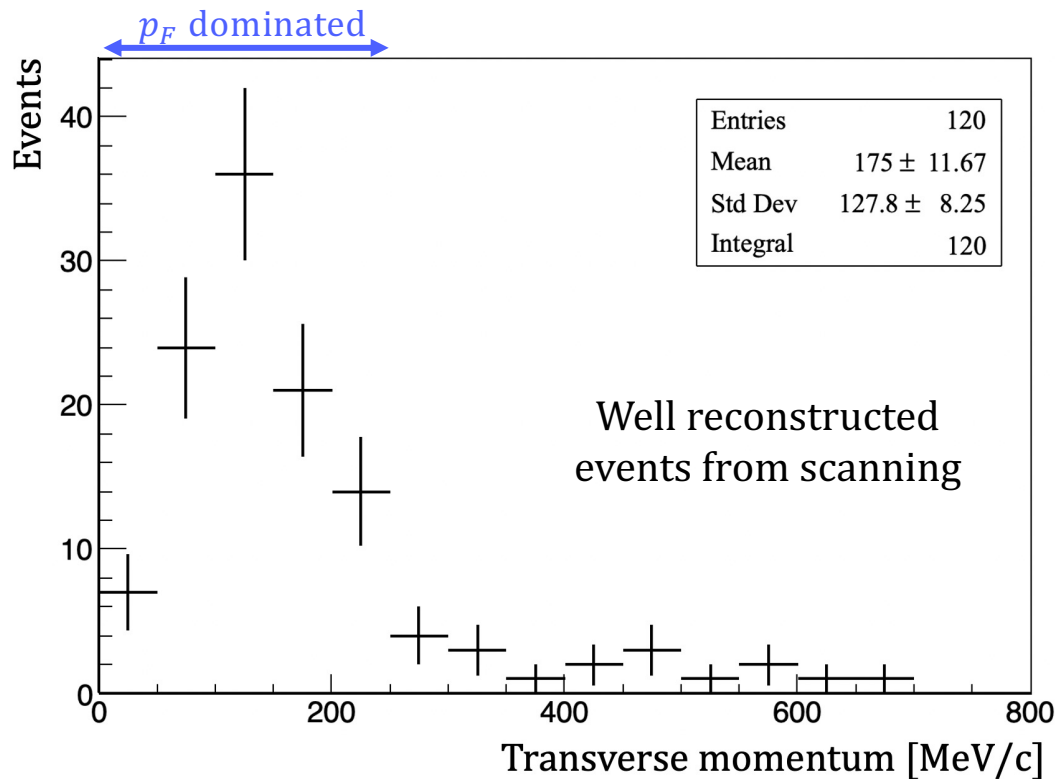
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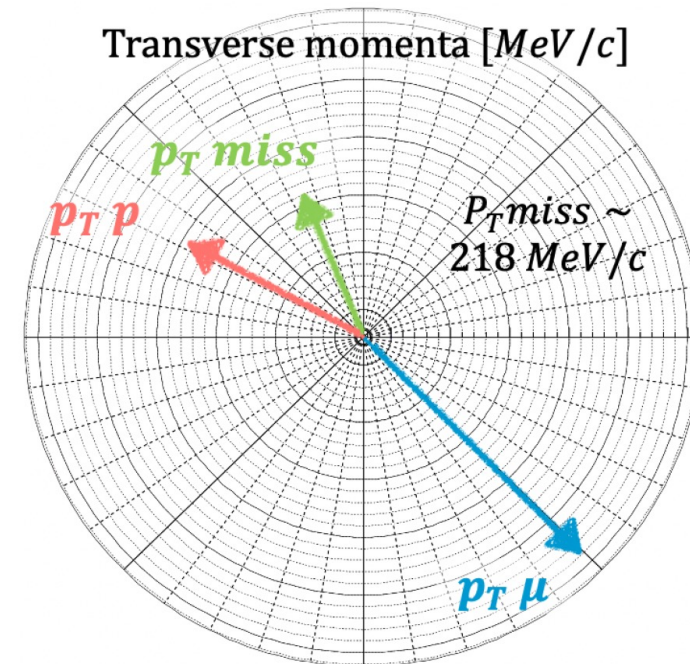
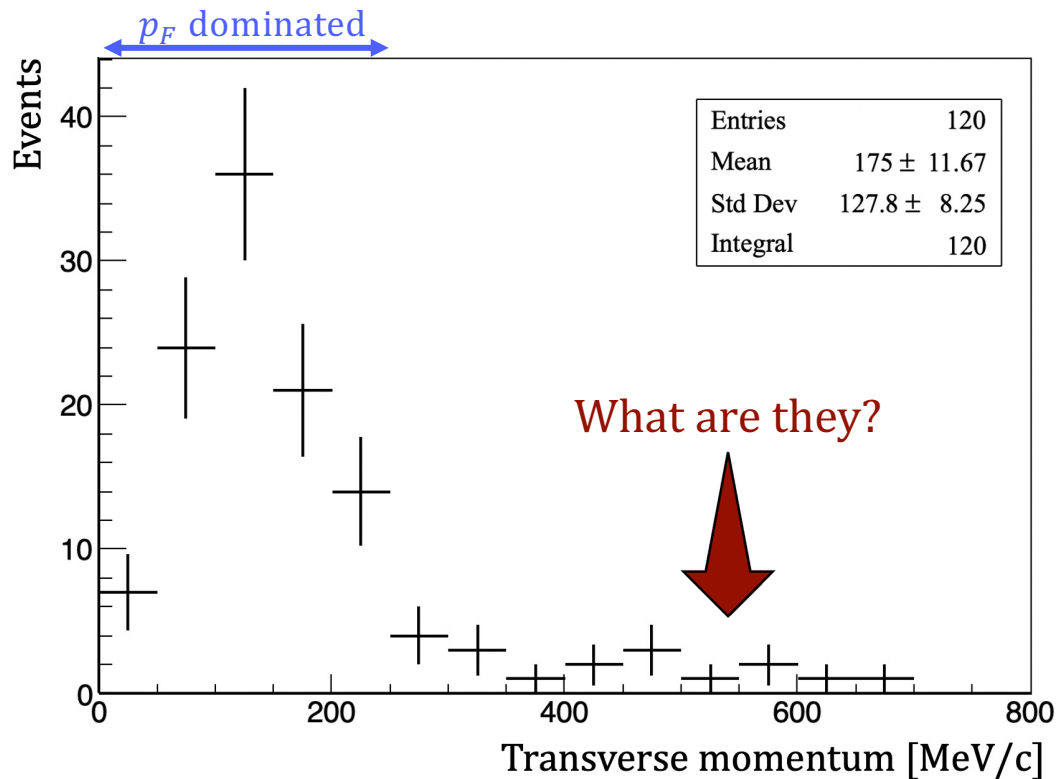
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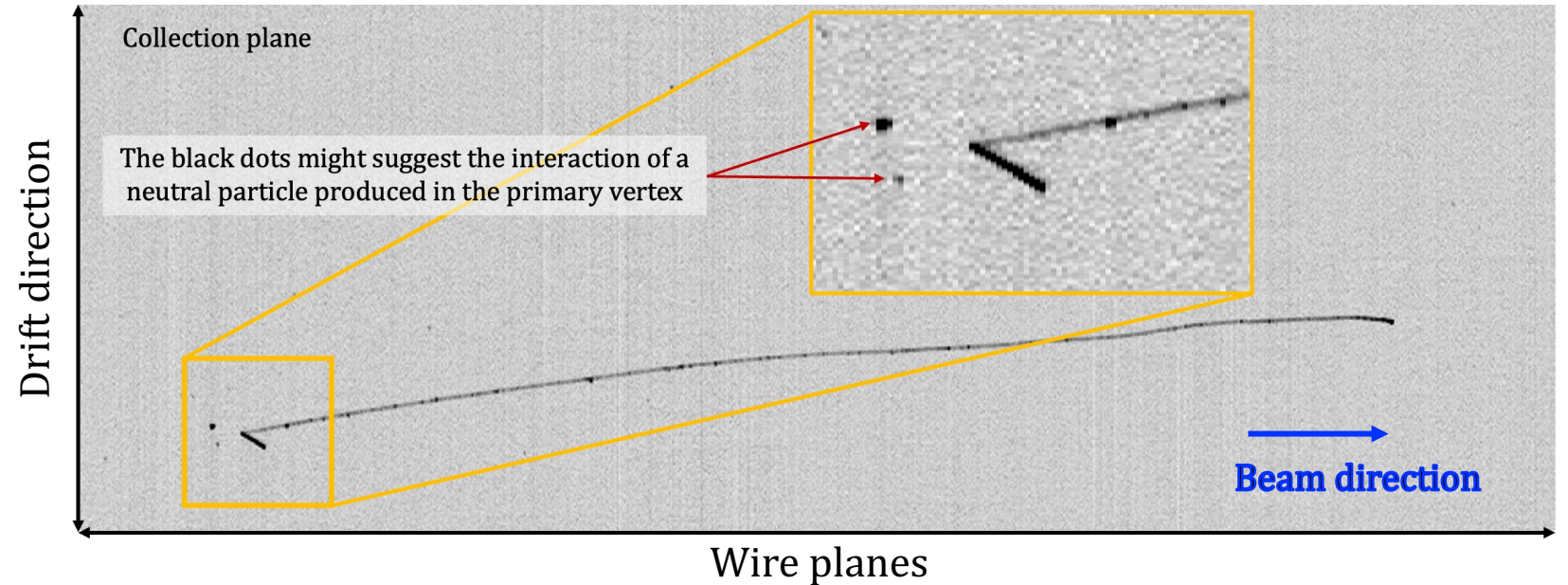
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# Events with large reconstructed $p_T$

BNB neutrino -  $1\mu 1p$  candidate


- 215 cm muon long
- 5 cm proton
- $p_T \sim 639 \text{ MeV}/c$



- In the visual scanning ...
  - Different hadrons might be wrongly classified as protons
  - Very short protons are not visible  $\rightarrow$  mis identified as  $1\mu 1p$  candidates
  - Neutrons and  $\sim \text{MeV}$  photons are very difficult to recognize, unless they do some interaction

# From scanning to automatic selection

- Due to the large number of collected events an automatic procedure to select  $1\mu 1p$  or  $1\mu Np$  candidates is mandatory
- Using the experience gained with previous analysis, a first test was performed on simulated events

  $\nu$  + cosmics MC production with  $\sim 3.2 \times 10^{20}$  POT

- **Truth** level definition of  $1\mu Np$  events
  - $\nu_{\mu} CC$  events with the interaction vertex inside the fiducial volume
  - 1 muon of at least 50 cm length
  - $\geq 1$  proton with deposited energy  $E_{dep} > 50$  MeV
  - **All** particles contained within 5 cm from the active TPC borders
  - No other particles with  $E_{dep} > 25$  MeV

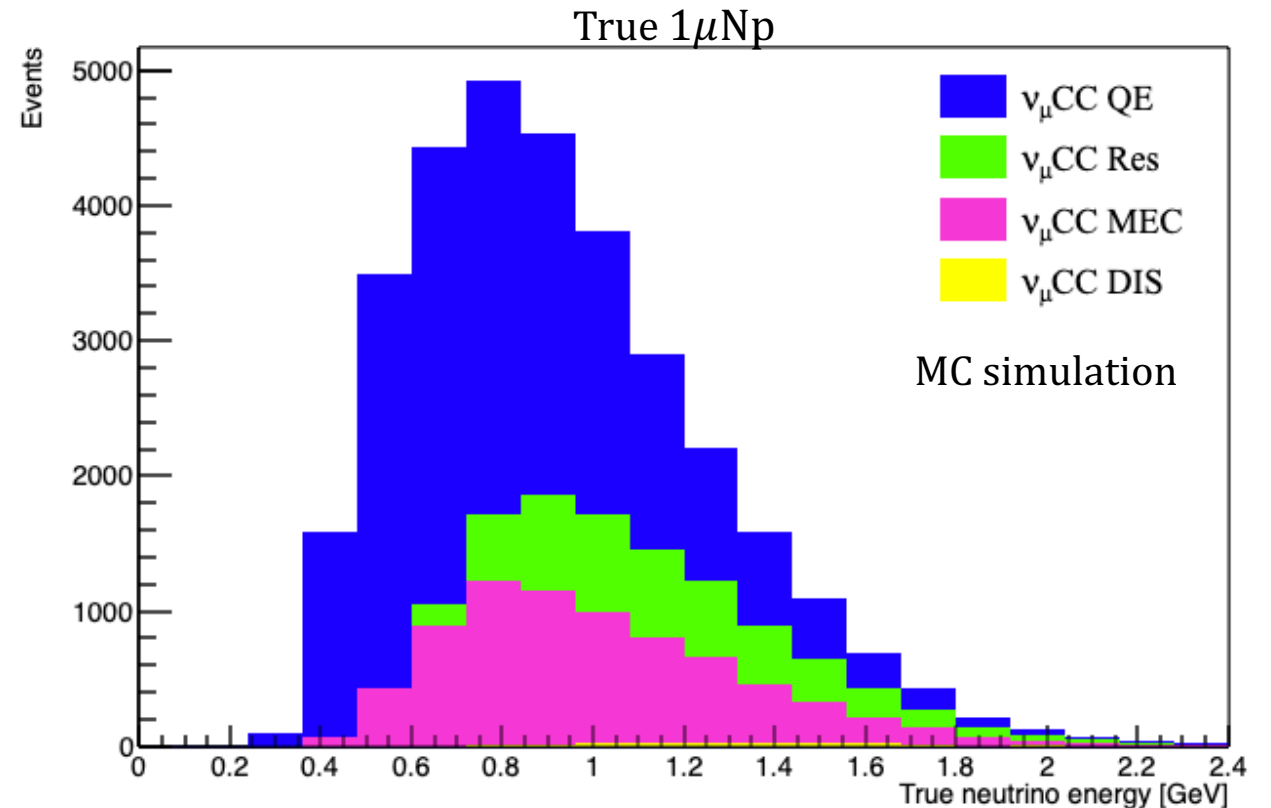
\*50 MeV proton  $\approx 2.3$  cm length



# MC Signal definition

- Using the previous definition and considering a MC exposure of  $2.5 \times 10^{20}$  POT ( $\sim$  total data collected POT Run 1+2),  $\sim 32.3$ k  $1\mu\text{Np}$  signal events are expected with the following true energy spectrum

Contribution	$2.5 \times 10^{20}$ POT
$\nu_\mu$ CC QE	62.4%
$\nu_\mu$ CC MEC	22.7%
$\nu_\mu$ CC Res	14.3%
$\nu_\mu$ CC DIS	0.6%
Total events	$\sim 32.3$ k

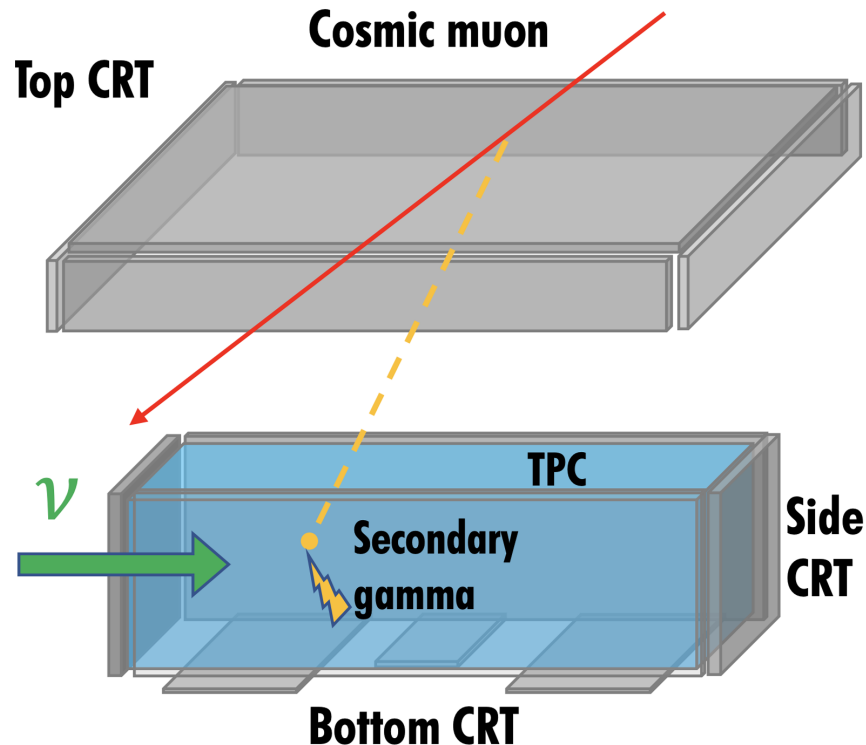


# Automatic selection of $1\mu Np$ contained events

- To select this  $1\mu Np$  signal the following automatic procedure was implemented

1. CRT Veto: no CRT-PMT in-time matching inside the  $1.6\ \mu s$  beam spill

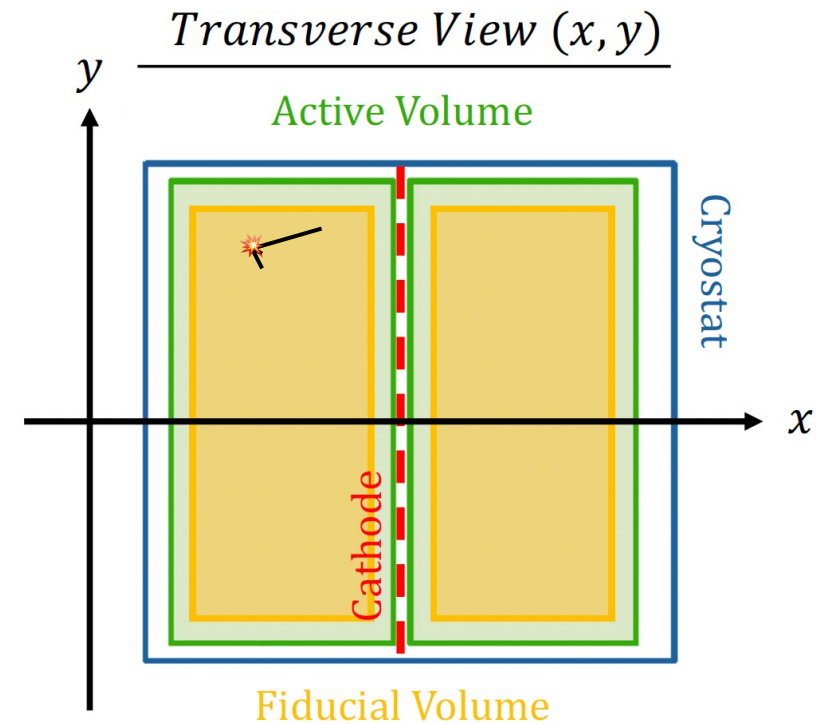
To strongly reduce events whose trigger is produced by in-spill cosmics or not contained  $\nu$  interactions



- No signal before the trigger: to reject external particles (cosmics)
- No signal after the trigger: to reject exiting particles

# Automatic selection of $1\mu Np$ contained events

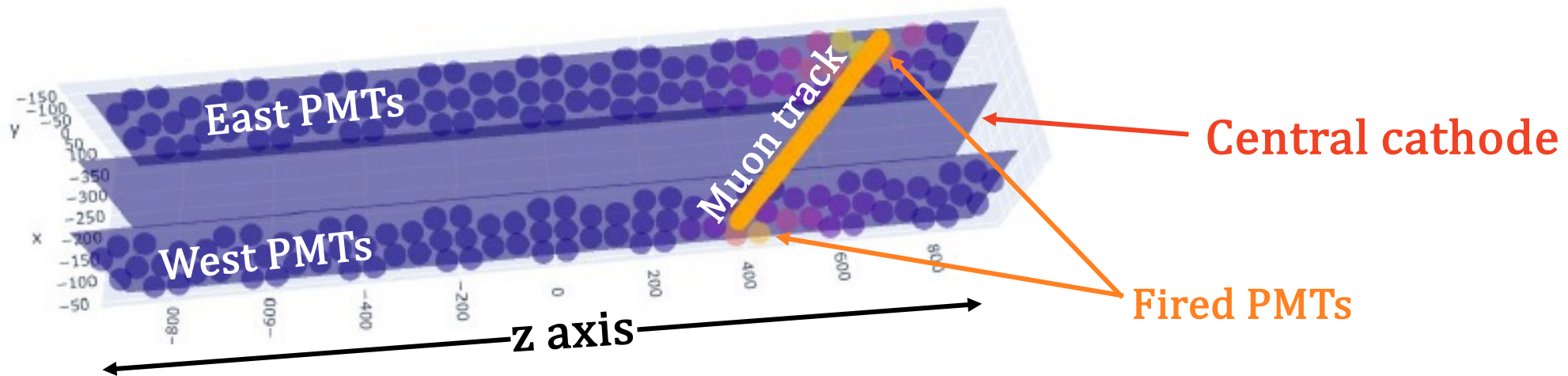
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  1. CRT Veto: no CRT-PMT in-time matching inside the  $1.6\ \mu s$  beam spill
  2. Events with reconstructed vertex inside **fiducial volume**  
To have a better control of the event reconstruction



# Automatic selection of $1\mu Np$ contained events

- To select this  $1\mu Np$  signal the following automatic procedure was implemented
  1. CRT Veto: no CRT-PMT in-time matching inside the  $1.6\ \mu s$  beam spill
  2. Events with reconstructed vertex inside fiducial volume
  3. TPC-PMT matching: require charge z-barycenter of interaction in the TPC to be within 1 m from the light z-barycenter of the triggering flash

To define the region of interest where the event is located, effectively rejecting out of spill cosmic events



# Automatic selection of $1\mu Np$ contained events

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  4. **All reconstructed** objects inside the slice need to be contained within 5 cm from the active TPC borders

To select contained events and avoid space charge effect distortions

\*Slice = Reconstructed object that encapsulates each interaction

# Automatic selection of $1\mu Np$ contained events

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  4. **All reconstructed** objects inside the slice need to be contained within 5 cm from the active TPC borders
  5. Muon identification corresponding to the longest track in the slice satisfying
    - Start point within 10 cm from the reconstructed vertex
    - Length of at least 50 cm
    - Tagged as a muon by the Particle identification tool



Selection of  $\nu_\mu$  CC contained events

# Automatic selection of $1\mu Np$ contained events

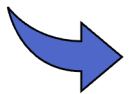
6. 0 reconstructed showers and pions (no other reconstructed primary tracks compatible with a muon)

Considering only reconstructed objects with  $E_k \geq 25$  MeV

\*25 MeV pion  $\approx$  2.5 cm length

# Automatic selection of $1\mu Np$ contained events

6. 0 reconstructed showers and pions (no other reconstructed primary tracks compatible with a muon)
7. Proton identification: the remaining reconstructed tracks needs to be tagged as a proton candidates
  - Start point within 10 cm from the reconstructed vertex
  - At least 50 MeV of kinetic energy, range-based measurement
  - Tagged as a proton by the Particle identification tool



Selection of  $1\mu Np$  contained events ready!

\*50 MeV proton  $\approx$  2.3 cm length



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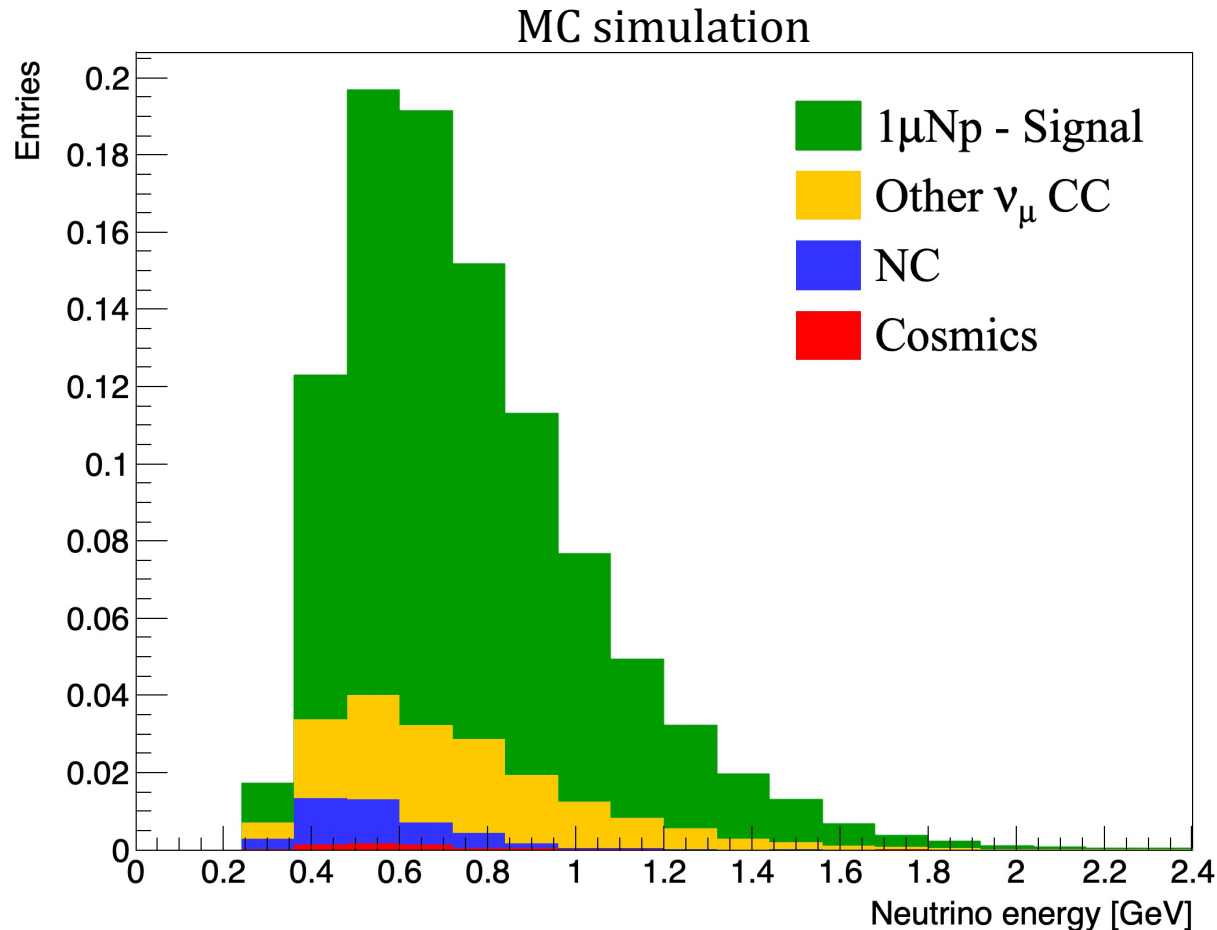


Selection of  $1\mu Np$  contained events ready!



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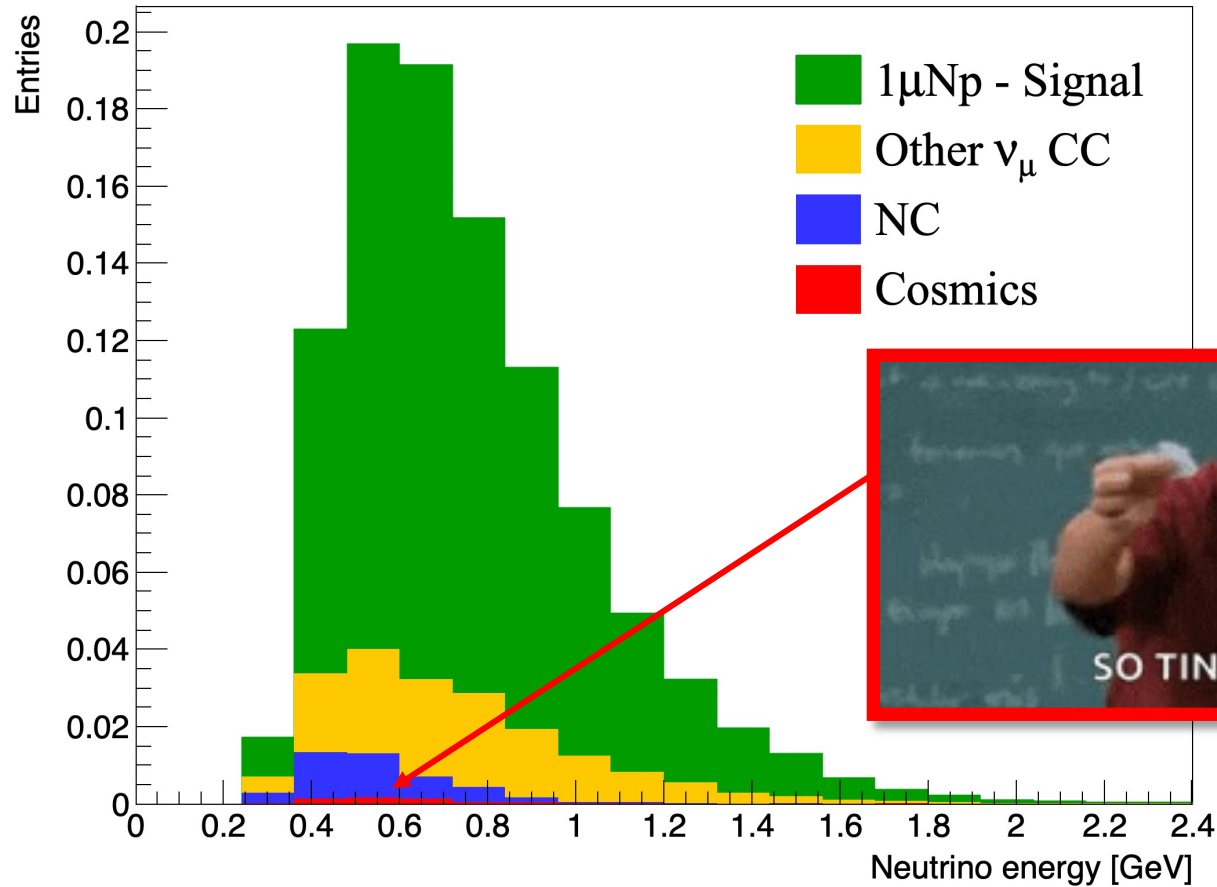


MC expectations

$$\text{Efficiency} = \frac{\text{Selected signal}}{\text{True signal}} \approx 48\%$$

$$\text{Purity} = \frac{\text{Selected signal}}{\text{All selected}} \approx 81\%$$

# Automatic selection of $1\mu Np$ contained events



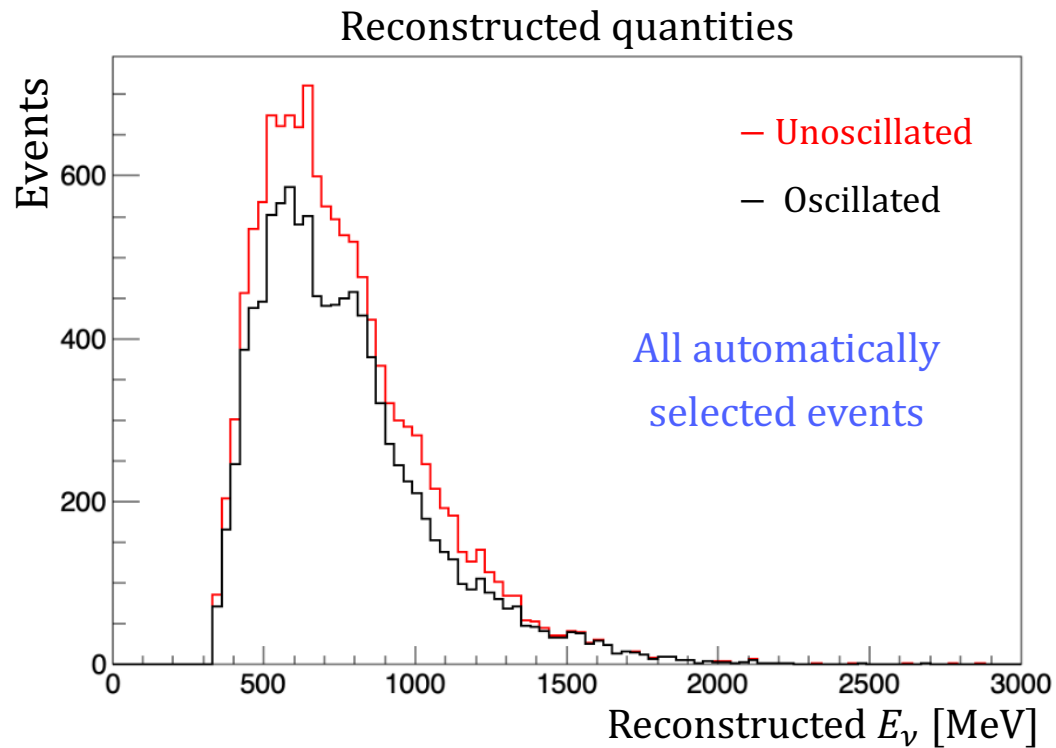
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# Oscillation hypothesis

- The ultimate goal of the event selection is to provide an oscillation measurement
- Example of a **hypothetical**  $\nu_\mu$  disappearance assuming  $\sin^2 2\theta_{\mu\mu} = 0.36$ ,  $\Delta m_{41}^2 = 7.3 \text{ eV}^2$  (Neutrino-4 results)

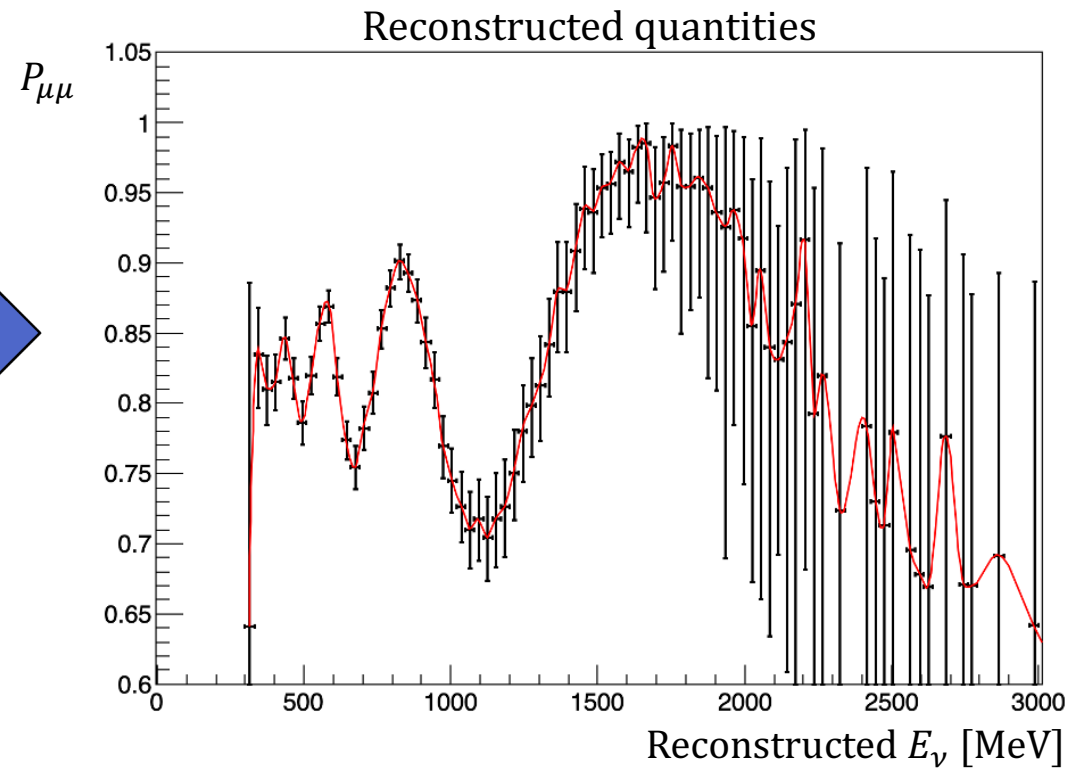
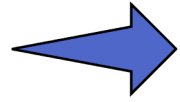
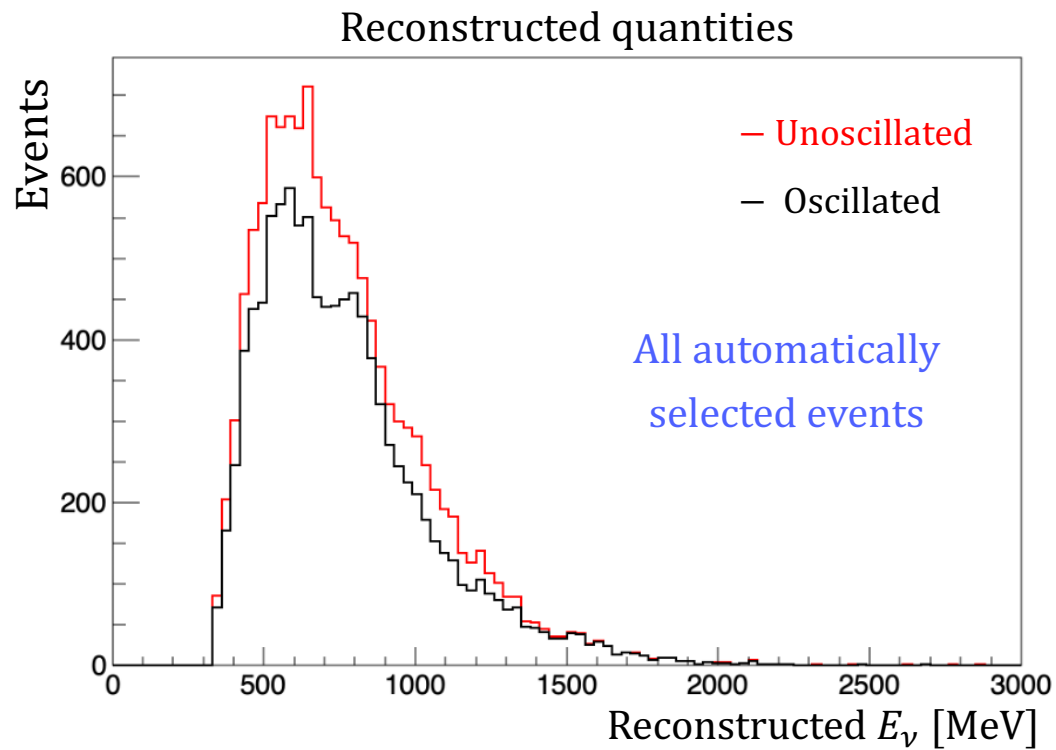


$$P(\nu_\mu \rightarrow \nu_\mu)_{SBL} \simeq 1 - \sin^2 2\theta_{\mu\mu} \sin^2 1.27 \frac{\Delta m_{41}^2 L}{E_{\nu_\mu, true}}$$

with  $E_{\nu_\mu, true}$  and L the true baseline

# Oscillation hypothesis

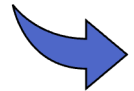
- The survival probability is obtained dividing the oscillated energy spectrum with respect to the unoscillated one



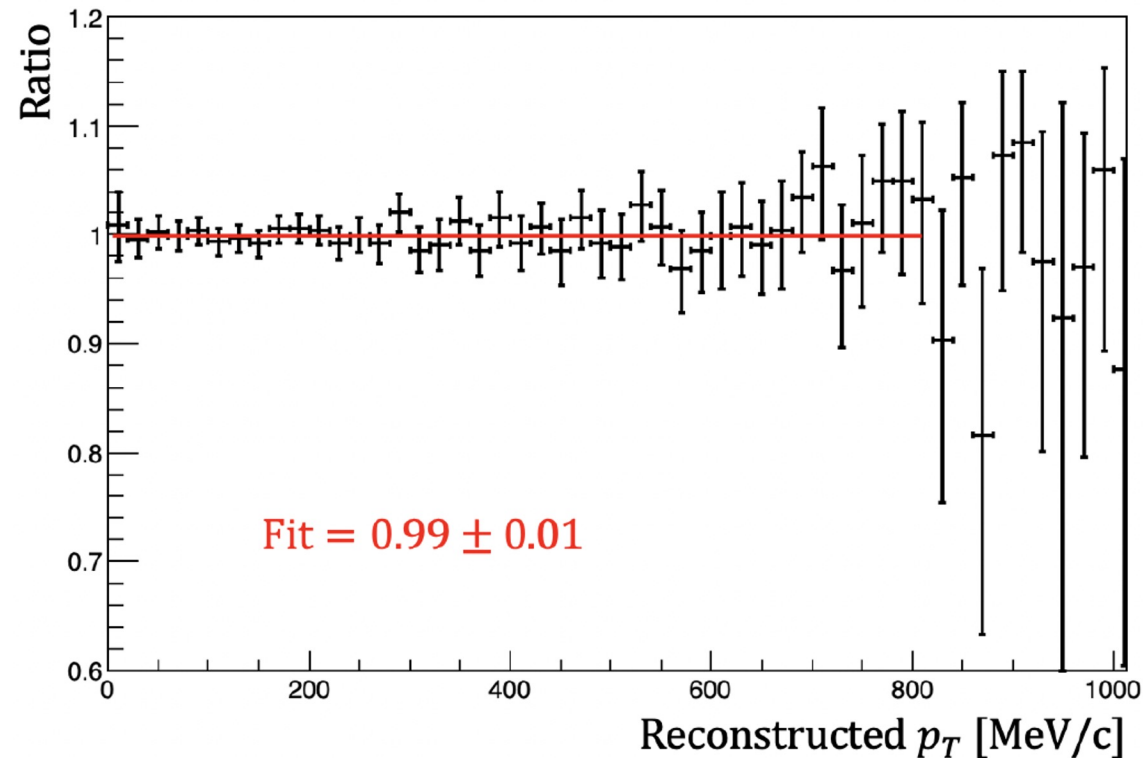
\*Only statistical errors are shown

# Oscillation hypothesis

- The transverse momenta was also studied showing that it is **not** affected by the mixing of sterile-active neutrino



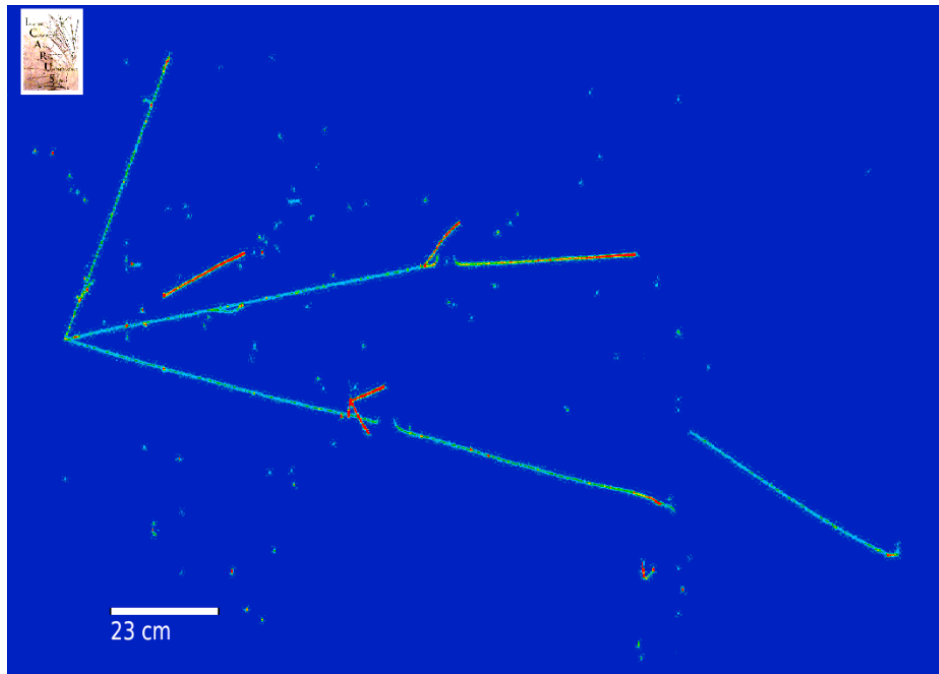
Can be exploited without inferring any neutrino oscillation property



\*Only statistical errors are shown

# Cross checks with data

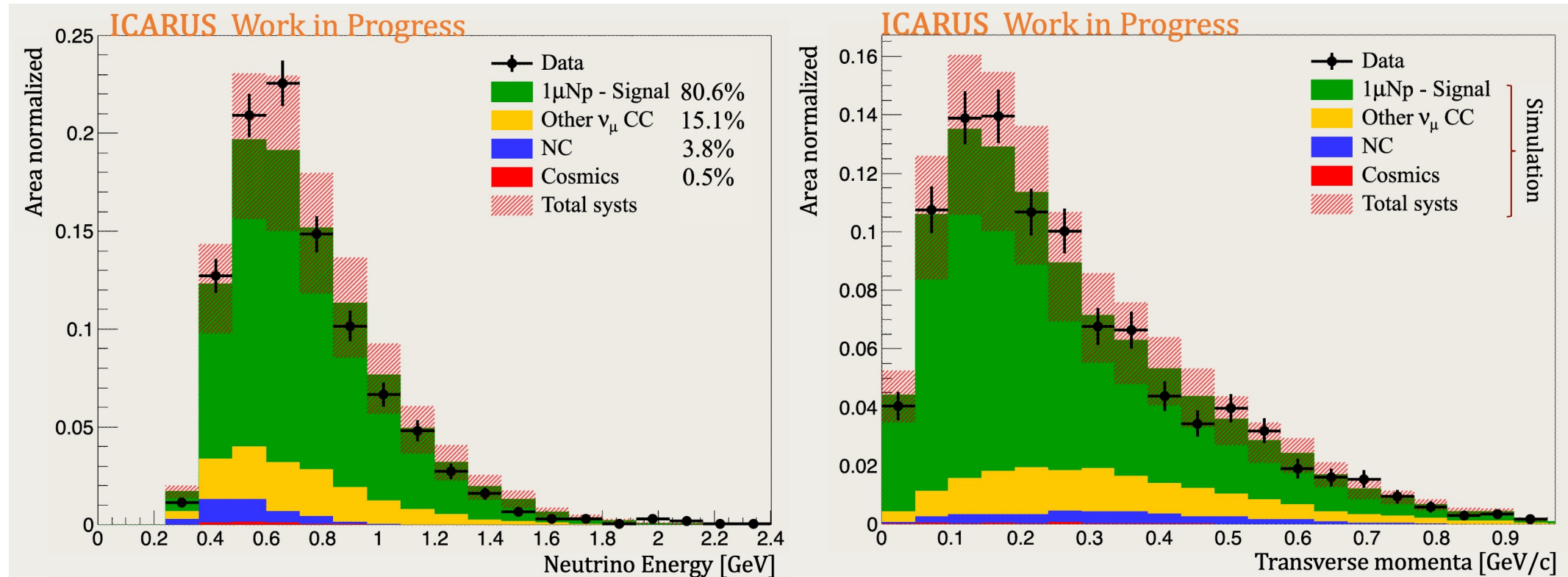
- Data efficiency and purity were evaluated with Run 9435 ( $\sim 2 \times 10^{18}$  POT)
- All candidates automatically selected were visually scanned to obtain the purity of the selection  $\sim 84\%$



- The selection efficiency was evaluated with an unbiased scanned sample using half of the entire Run 9435
    - 100  $1\mu\text{Np}$  were chosen as a reference
- ➡ The developed automatic selection identified 48 of them, reporting an Efficiency of 48%
- MC study:  $\sim 48\%$  Efficiency and  $\sim 81\%$  Purity

# Data – MC comparison

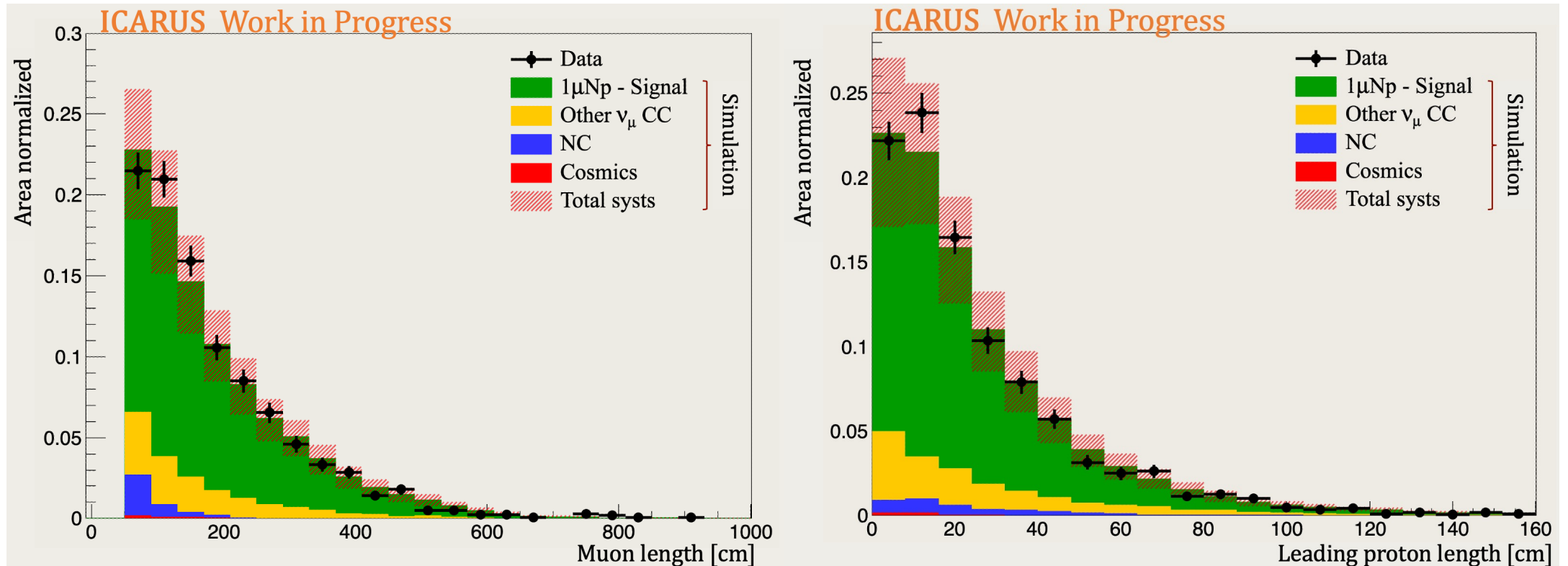
- The automatic selection was applied to the whole MC sample and  $\sim 10\%$  of total collected data
  - To perform Data – MC comparison in accordance with the blinding policy
- Shape only analysis with systematic uncertainties



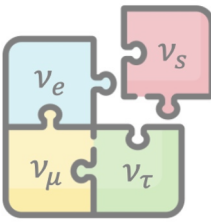


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# Conclusion and perspectives



- My thesis was intended to pave the way towards a BNB  $\nu_\mu$  disappearance analysis

A first step to test the Neutrino-4  $\bar{\nu}_e$  oscillation hypothesis

1. ICARUS detector and reconstruction algorithms' performance validation

Visual scanning campaign proving ICARUS capability to perform calorimetric studies, particle identification and kinematic reconstruction of contained  $1\mu 1p$  events

2. Development of an automatic selection to identify  $1\mu Np$  events

Simulation studies were performed leveraging all 3 detector subsystems  $\Rightarrow$  achieving 81% purity and 48% efficiency

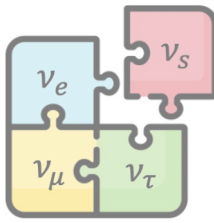
- Small **data** sample was used to estimate the sample purity ( $\sim 84\%$ ) and selection efficiency ( $\sim 48\%$ )

- Data – simulation comparison showing reasonable agreement

More statistics are needed together with a quantitative comparison

**$1\mu Np$  automatic selection ready to be used !**

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## Thank you!



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