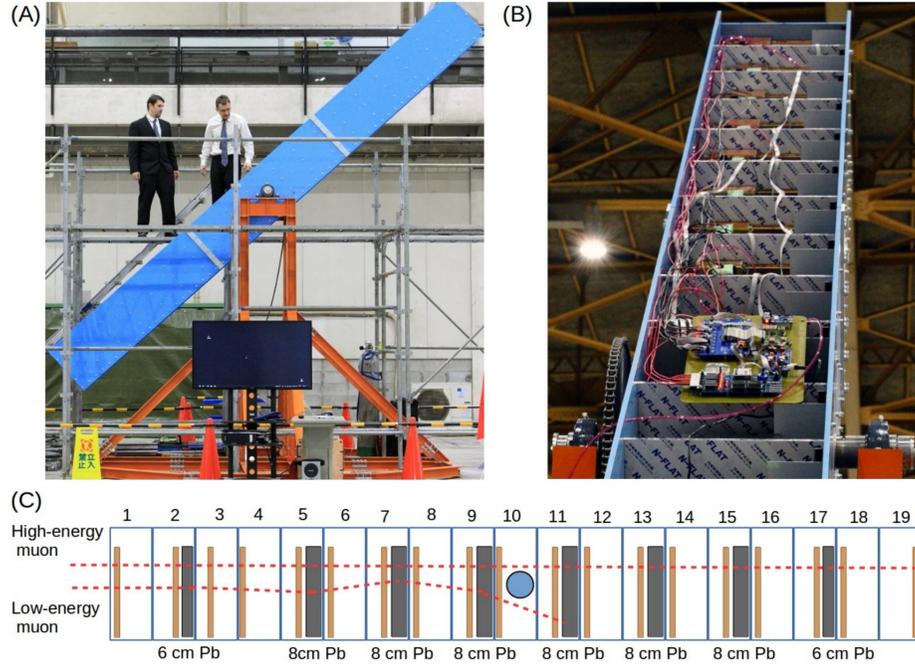


## A Rotatable Muon Spectrometer

### Motivation:

- Measurement of the energy dependent muon fluxes, called spectra, has numerous applications
- High-energy spectra (well beyond the few tens of GeV): studying of particle generation beyond accelerator energies, improve the understanding of extensive air showers, estimating of atmospheric neutrino fluxes, etc.
- Low-energy spectra (upto a few tens of GeV): investigating of the physical properties of the atmosphere, the effects of Earth's magnetic field, studying neutrino decays, etc.
- Muographic imaging utilizes the muon spectra to determine the density-lengths through the investigated targets
- The spectra data are scarce at low-energies that limits the muography of few-meter-sized targets



**Figure 1.** Photographs about the spectrometer from side (A) and front (B) views. (C) Schematic drawing of the arrangement of 19 detectors and 8 lead walls.

### Experimental apparatus:

- 6 m long rotatable tracking system consists of 19 Multi-wire-proportional chambers (MWPCs) + 8 lead walls (Figure 1)
- The MWPCs provide positional resolution of 4 mm in 1+1 dimension
- Non-flammable, non-toxic Ar-CO<sub>2</sub> (80%-20%) gas mixture is flushed across MWPCs with the typical flow of 1 L/h.
- The high-voltage of 1750 V applied on the anode wires to achieve the reasonable detection efficiency of above 98 %.
- Data collection triggered by the triple coincidence of MWPCs
- Data acquisition controlled by a microcomputer
- High energy physics data analysis methods (cluster reconstruction, combinatorial tracking algorithm) are applied for track reconstruction

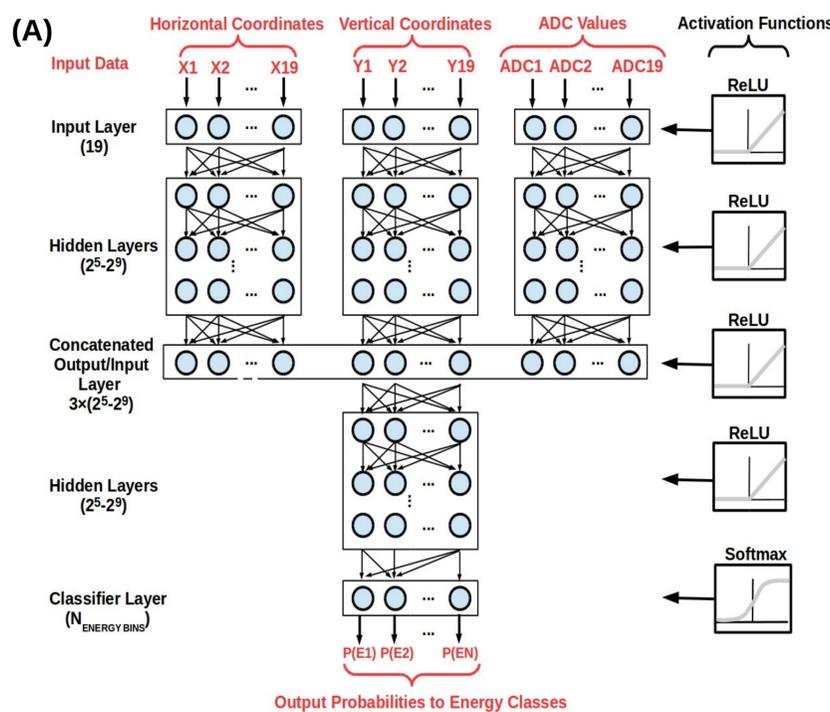
## A Neural Network-based Muon Spectra Analyzer

### GEANT4 simulation:

- The spectrometer was constructed in GEANT4 framework
- 200,000 muons were injected into the setup with a uniform energy distribution up to 10 GeV
- All relevant electromagnetic physics processes were involved
- Coordinates and energy depositions were reconstructed in each detector layer

### Data preparation to machine learning:

- Event-by-event analysis were applied
- Horizontal and vertical coordinates were transformed to detector system
- Energy depositions were summed for each track within an event.
- Total energy deposition distributions were scaled with  $a \times E + b$  functions to accurately approximate the measured ADC distributions for each detectors



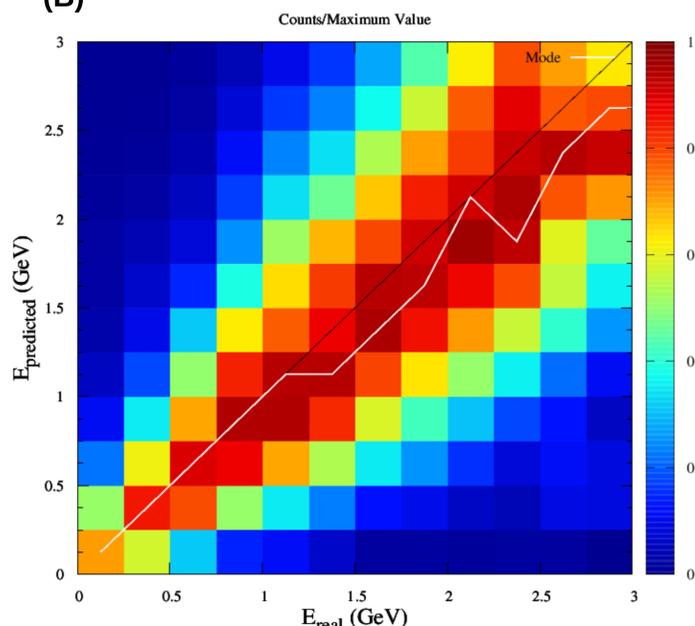
### Neural Network:

- 19 horizontal coordinates, 19 vertical coordinates and 19 scaled energy deposits (ADCs) were parallelly read into inputs of neural network (Figure 2A)
- The output layers of three neural networks were concatenated further layers were added with ReLU activation functions
- A classification layer were added with Softmax activation function → bin size of 0.25 GeV was used (Figure 2B)
- Model were optimized to minimize the relative difference between the simulated spectra and results of classification

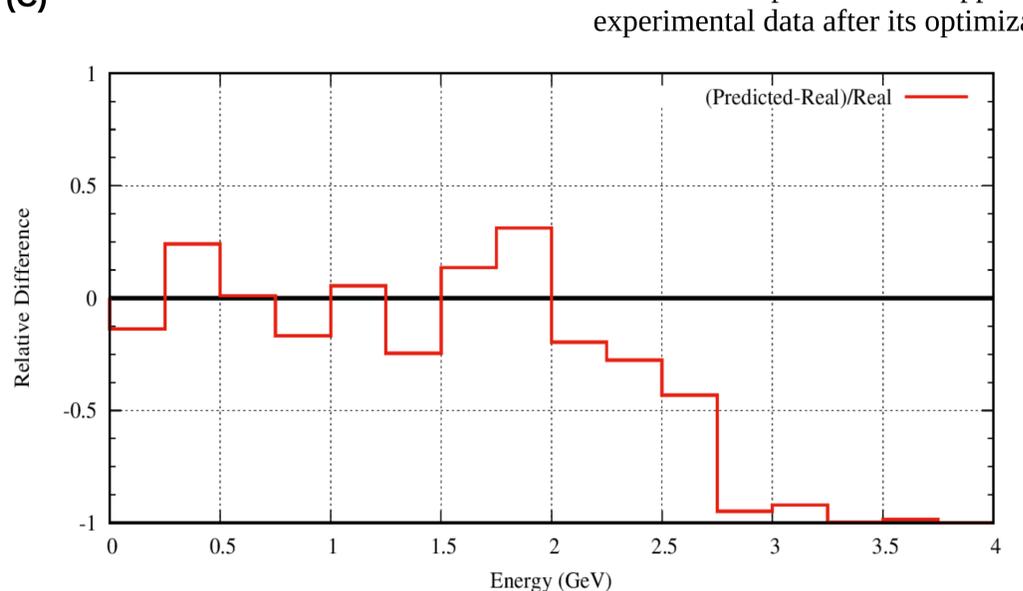
### Preliminary Results:

- Neural network achieved a moderated accuracy of 0.6 and average relative spectra ratios of 0.2 and 0.26 below 2 and 2.5 GeV respectively (Figure 2C)
- The model is planned to be applied on experimental data after its optimization

(B)



(C)



**Figure 2.** (A) Schematic drawing of neural network applied for muon energy classification. (B) Predicted energy is shown as a function of simulated ("real") energy. (C) Relative spectra ratio, (predicted-real)/real, is shown as a function of energy.