

# On the clustering methods of large muon events on the LVD detector

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# Introduction

# Large Volume Detector



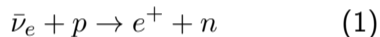
Figure: LVD @ INFN Gran Sasso National Laboratory

Underground neutrino observatory mainly designed to study neutrinos from core-collapse supernovae

# LVD

3 towers by  $8 \times 5 \times 7 = 840$  counters

Main neutrino reaction:



LVD can act as a beam monitor, detecting the interaction of neutrinos inside the detector and the muons generated by the  $\nu_\mu$  interaction in the rock upstream detector.

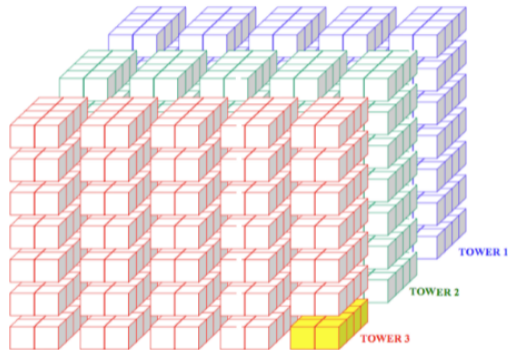


Figure: LVD counters arrangement scheme

# Large muon event registration

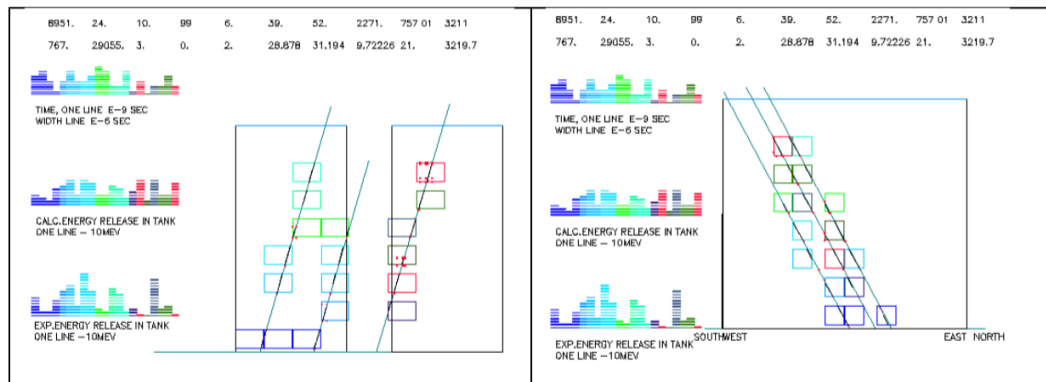


Figure: Multiple muon registration

# Problem

# Problem Statement

- ① Neutrino bursts identification idea based on clusters of active events detecting
- ② The task of clustering events in a partially ordered time series of detector counter readings
- ③ Clipping the size of events leads to
  - loss of large series detection
  - systematic error accumulation in the spectral distributions of observations



# Previously. Fixed window approach

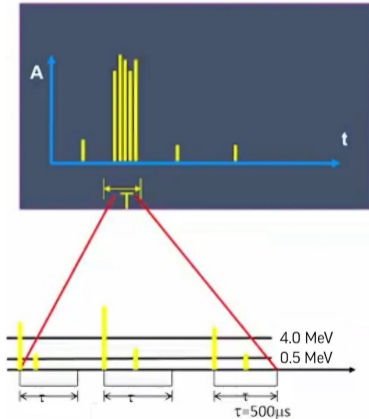


Figure: fixed window detection

Window opens at High energy threshold and listening everything for fixed time  $\tau$ .

# Methods

# Preliminaries

Consider discrete-continuous impulse system where:

- the sequence number corresponds to the discrete internal time of the system
- the timestamp corresponds to the continuous "spatial" variable

# Preliminaries. General log of all pulses of all counters

High density of pulses  
inside the event

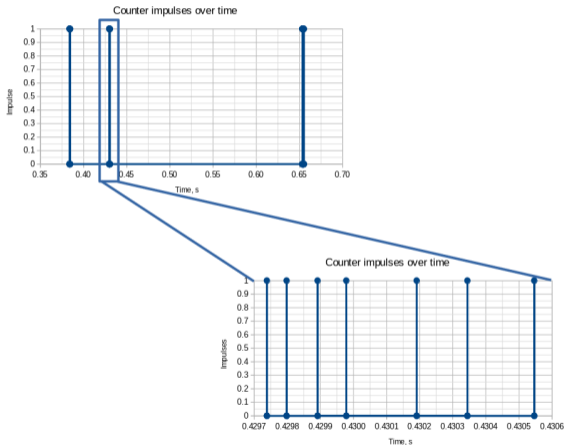


Figure: time series pulse log

# Preliminaries

In order to separate events recorded in a single storage asynchronously, it is necessary to arrange them by a temporary variable

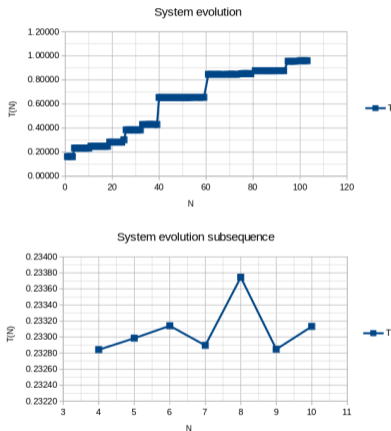


Figure: time series evolution

# Preliminaries. Sorting epoch

- 1 Fill buffer
- 2 Sort it
- 3 Flush buffer until pivot
- 4 Move values after pivot instead of flushed elements

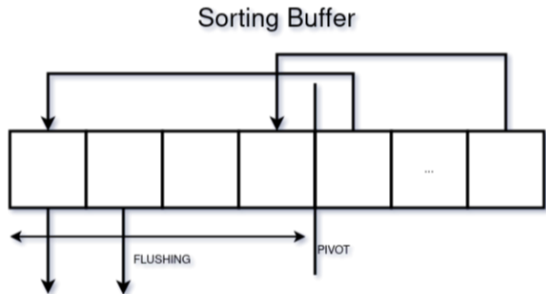


Figure: time series evolution

# Preliminaries. After reordering

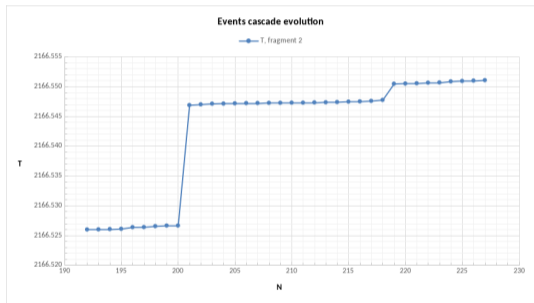


Figure: Events cascade evolution fragment

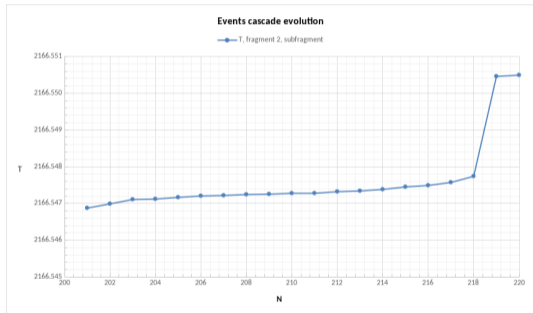


Figure: Events cascade evolution, its sub-fragment

## Hypotheses 1. Uniform time evolution

The evolution of a time series system corresponds to an pulse system  $T(N)$ . Let us assume that temporal variable increases uniformly within an event cluster:

$$T(N + \Delta N) = T(N) + \Delta T = T(N) + k\Delta N \quad (2)$$

Thus, we require an invariant of the slope value' for cluster  $C_k$ :

$$k = T(N + 1) - T(N) \quad \forall N, N + 1 \in C_k \quad (3)$$



## Hypotheses 2. Non-increase variance

Assuming a normal error distribution, it can be assumed that the "next" temporal element, which strongly changes the variance of all calculated slopes of the event, does not fit to it.

For  $C_k = N_{k_0}, \dots, N_{k_i}$

$$\sigma_i^2 = \text{Var} X(N_{k_0} : N_{k_i}), \sigma_{i+1}^2 = \text{Var} X(N_{k_0} : N_{k_i}) \cup \{k_{i+1}\}, \quad (4)$$

$$(i + 1) \notin C_k \Leftrightarrow \sigma_{i+1}^2 \gg \sigma_i^2 \quad (5)$$

# Splitters

Let each of the online observers of the time series have a *CRIT* value, the overcoming of which indicates the fulfillment of the hypothesis condition

①

$$k_{i+1} > k_{CRIT}$$

②

$$\frac{|k_{i+1} - \bar{k}|}{\bar{k}} > \varepsilon_{CRIT}$$

③

$$\sigma_{k+1}^2 - \sigma_k^2 > \Delta Var_{CRIT}$$

④

$$\frac{|\sigma_{i+1}^2 - \sigma_k^2|}{\sigma_k} > \varepsilon Var_{CRIT}$$

# Welford's statistics

Storing all cluster values consume memory. Calculating "Online": Regular

$$\bar{x}_n = \frac{(n-1)\bar{x}_{n-1} + x_n}{n} = \bar{x}_{n-1} + \frac{x_n - \bar{x}_{n-1}}{n}$$

$$\sigma_n^2 = \frac{(n-1)\sigma_{n-1}^2 + (x_n - \bar{x}_{n-1})(x_n - \bar{x}_n)}{n} = \sigma_{n-1}^2 + \frac{(x_n - \bar{x}_{n-1})(x_n - \bar{x}_n) - \sigma_{n-1}^2}{n}$$

Subtracting a small number from a large number  $\rightarrow$  float point arithmetic instability

# Welford's statistics

Storing all cluster values consume memory. Calculating "Online": Welford

$$\bar{x}_n = \frac{(n-1)\bar{x}_{n-1} + x_n}{n} = \bar{x}_{n-1} + \frac{x_n - \bar{x}_{n-1}}{n}$$

$$M_{2,n} = M_{2,n-1} + (x_n - \bar{x}_{n-1})(x_n - \bar{x}_n)$$

$$\sigma_n^2 = \frac{M_{2,n}}{n}$$

# Voting ensemble

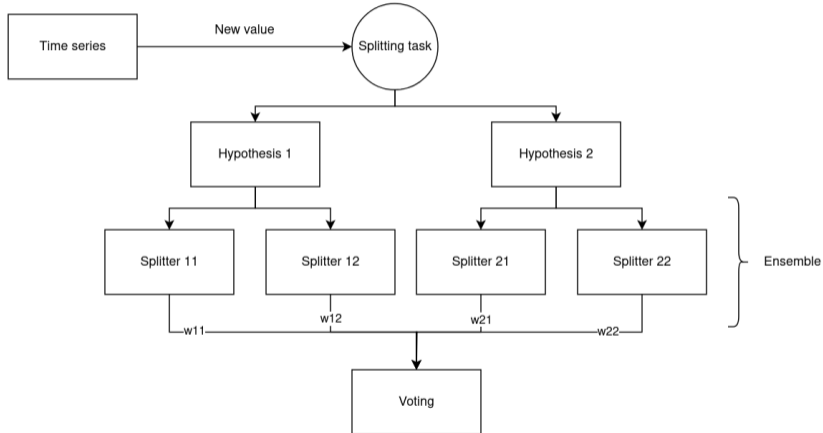


Figure: scheme of voting ensemble

# Analysis

# Measurements density

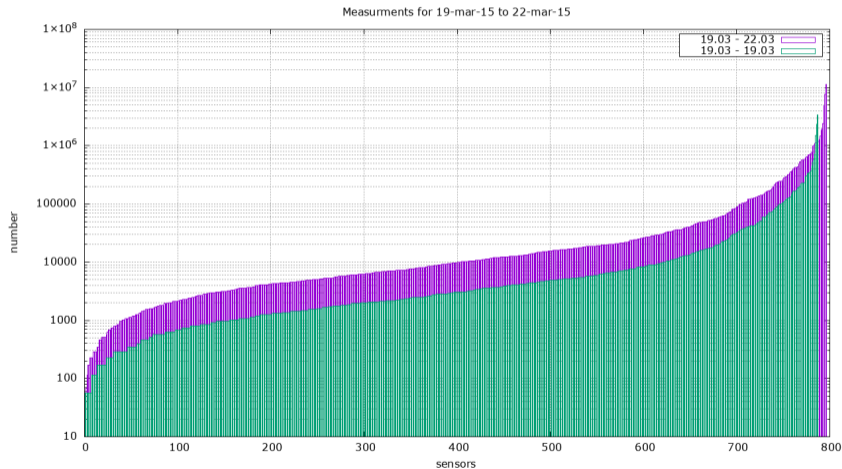


Figure: Counters pulse density

# T(N) Evolution

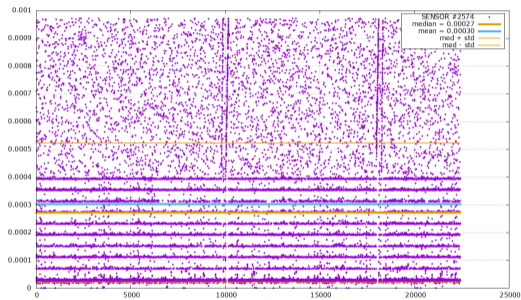


Figure: Counter evolution

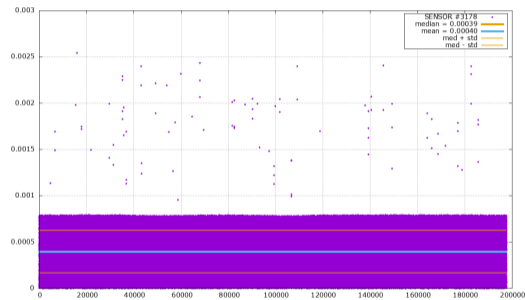
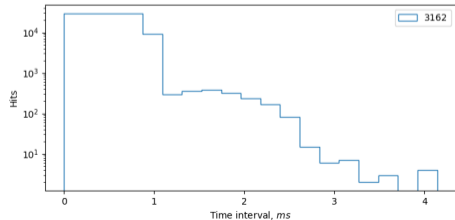
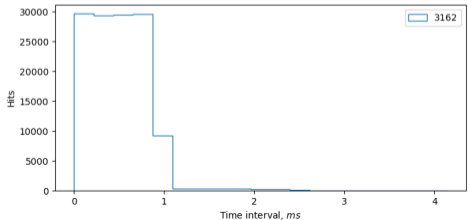
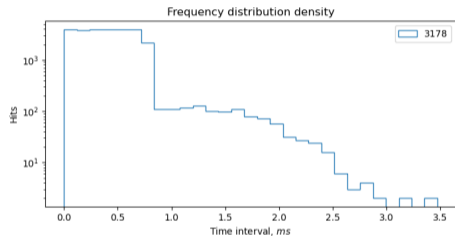
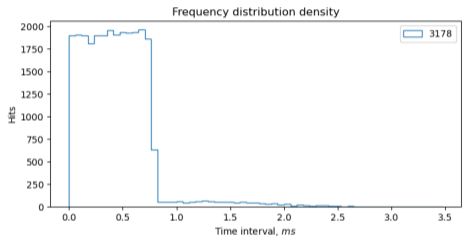


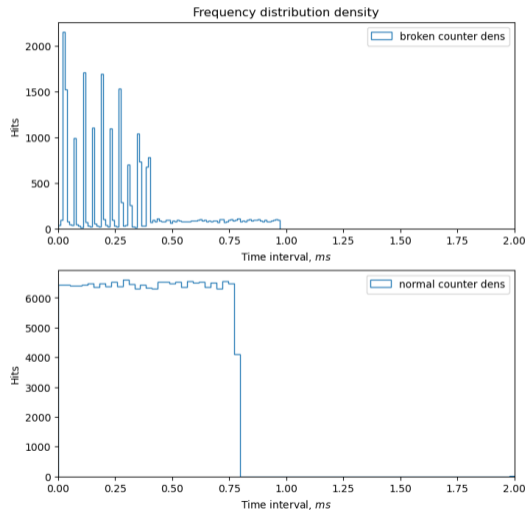
Figure: Counter evolution



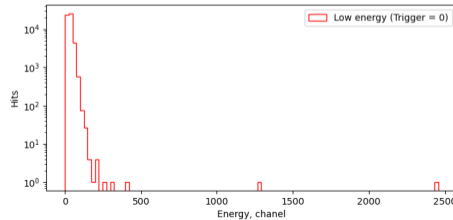
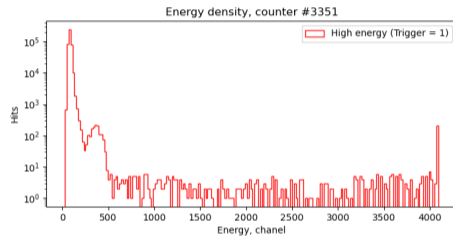
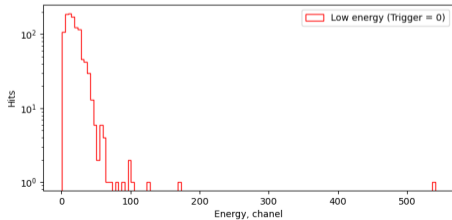
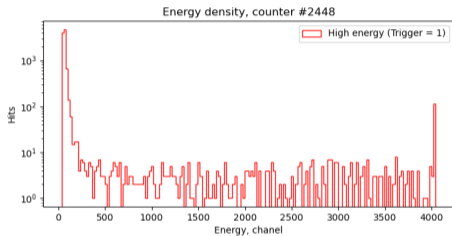
# Distribution of the counting rate



# Normal and probably broken counter comparison



# Distribution of the energy






# Conclusion

# Conclusion

The considered approach can be applied to the problem of clustering muon large events on the LVD

# References I

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-  *Agafonova, N., Aglietta, M., Antonioli, P., Bari, G., Bonardi, A., Boyarkin, V., Bruno, G., Fulgione, W., Galeotti, P., & Garbini, M. On-line recognition of supernova neutrino bursts in the LVD. Astroparticle Physics, 28(6), 516–522. (2008)*
-  *M. Aglietta, B. Alpat, E.D. Alyea, P. Antonioli and etc Multiple muon events observed in the LVD experiment, Nuclear Physics B - Proceedings Supplements, 35, 243-245. (1994)*