



# DETECTING THE PREPARATORY PHASE OF INDUCED EARTHQUAKE AT THE GEYSERS (CALIFORNIA) USING K-MEANS AND LSTM

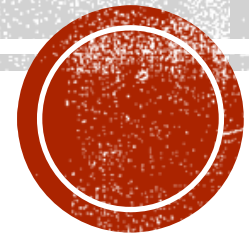
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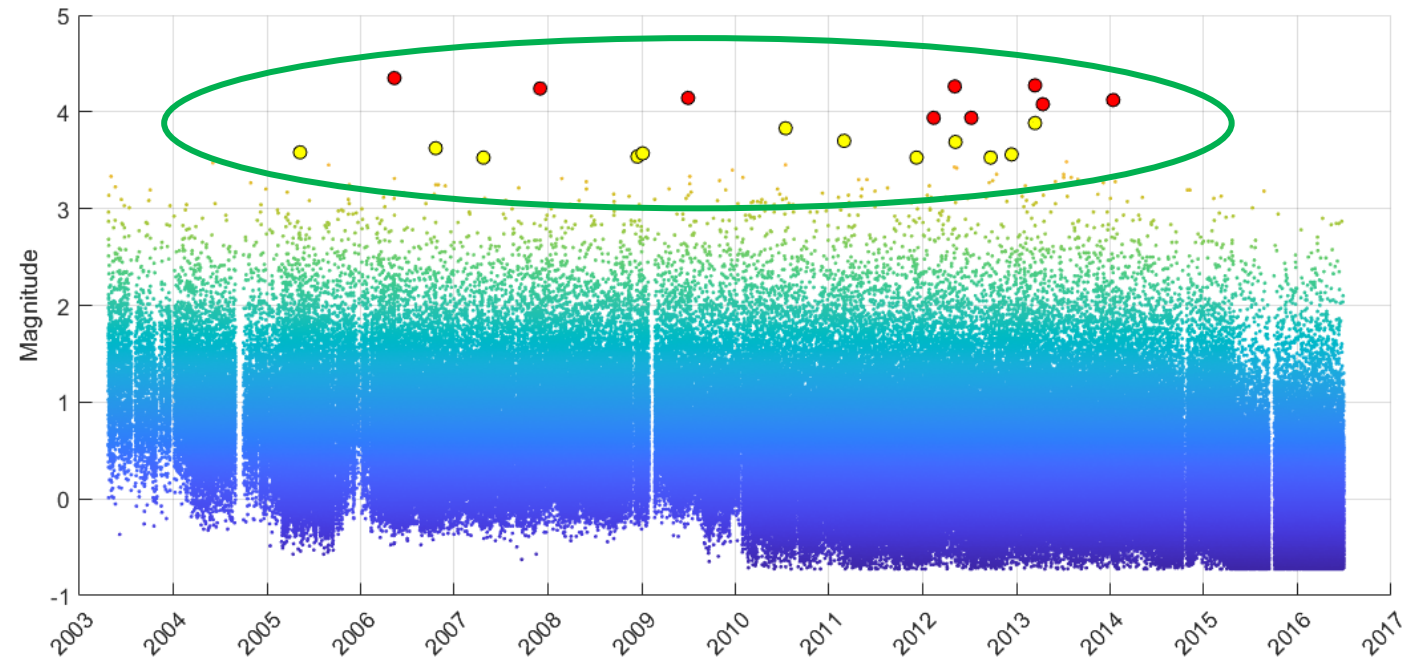
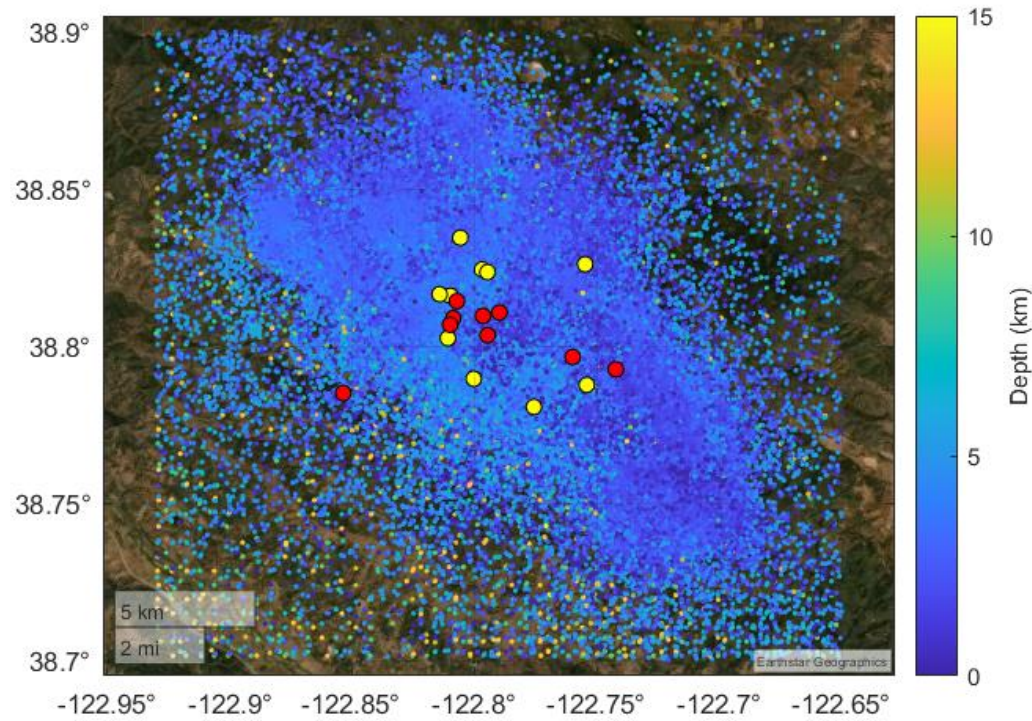


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# THE GEYSERS DATASET

More than 400.000 events, with magnitude range of  $(-0.7, 4.3)$ .

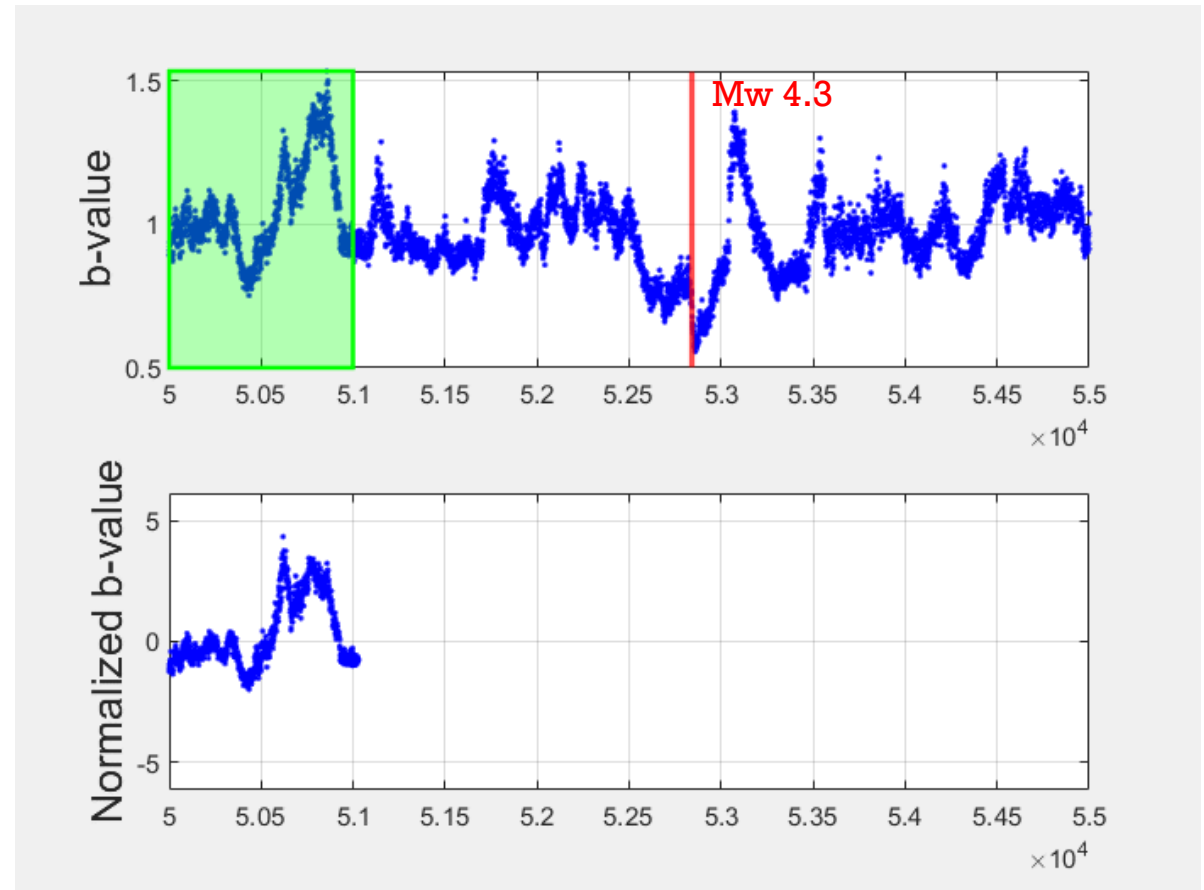


# FEATURES NORMALIZATION

Following the results of our previous work (Picozzi and Iaccarino, 2021), we computed physics-related features using a 200-event moving window on catalog information.

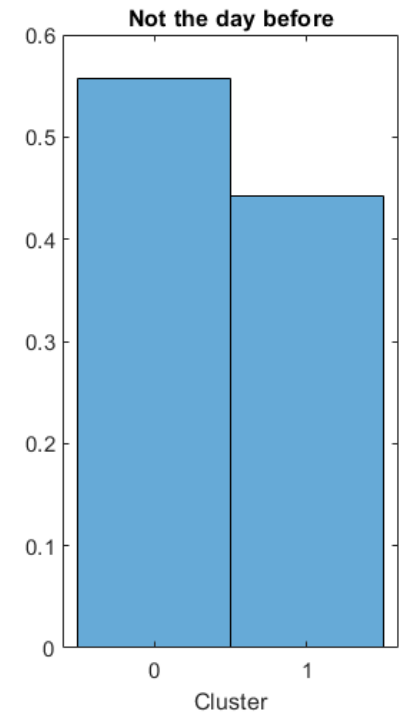
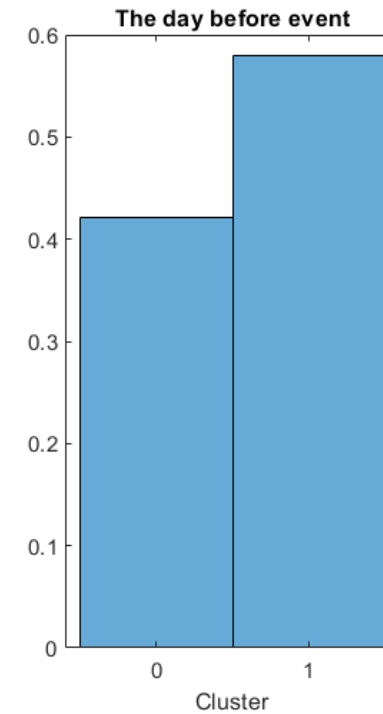
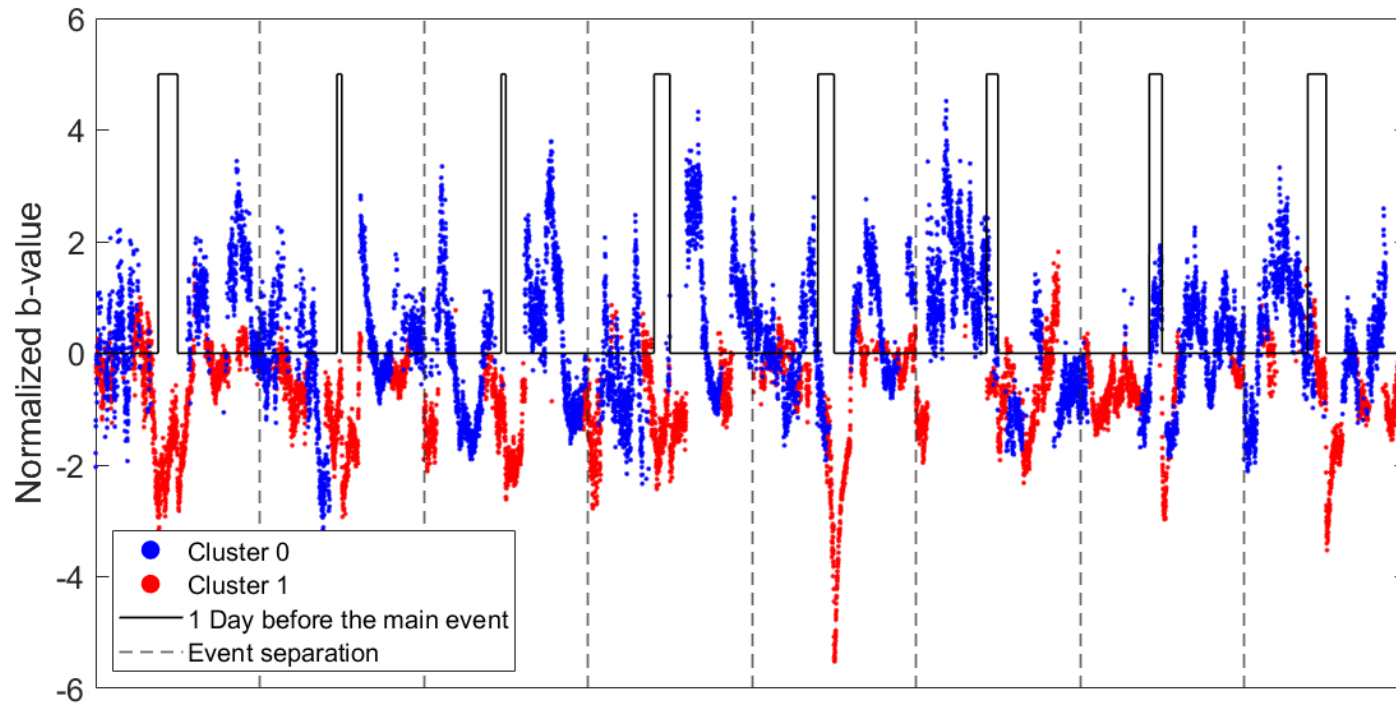
We used 5 features ( $b$ ,  $Mc$ ,  $Dc$ ,  $dt$ ,  $\Delta T$ ) to unveil the possible presence of preparatory phase.

We standardized these feature using a moving procedure, in order to maintain the causality of the method.



# K-MEANS CLUSTERING

Events with  $3.9 < M_w < 4.3$

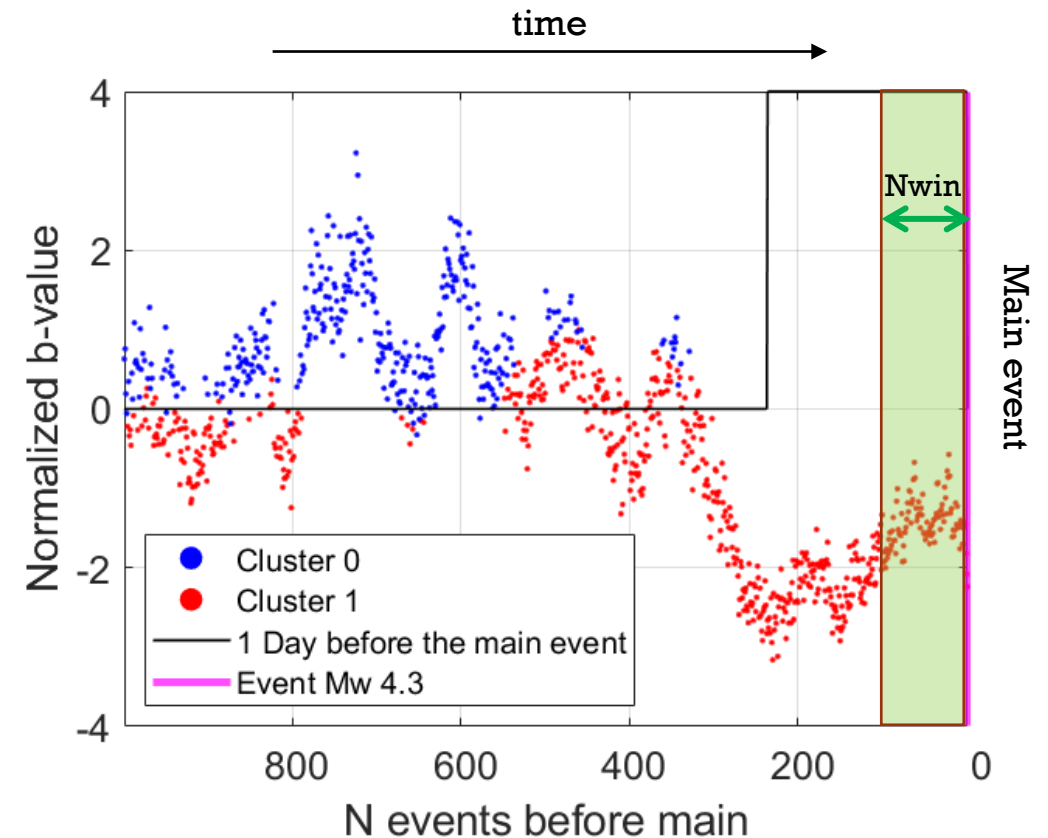




# LABELING THE PREPARATORY PHASE FROM CLUSTERING ANALYSIS

Let's define the deviation from homogeneity ( $\Delta_{cl1}$ ) in this way:

$$\Delta_{cl1}(N_{win}) = \frac{N_{cl1}(N_{win})}{N_{win}} - \frac{N_{cl1}(1000)}{1000}$$

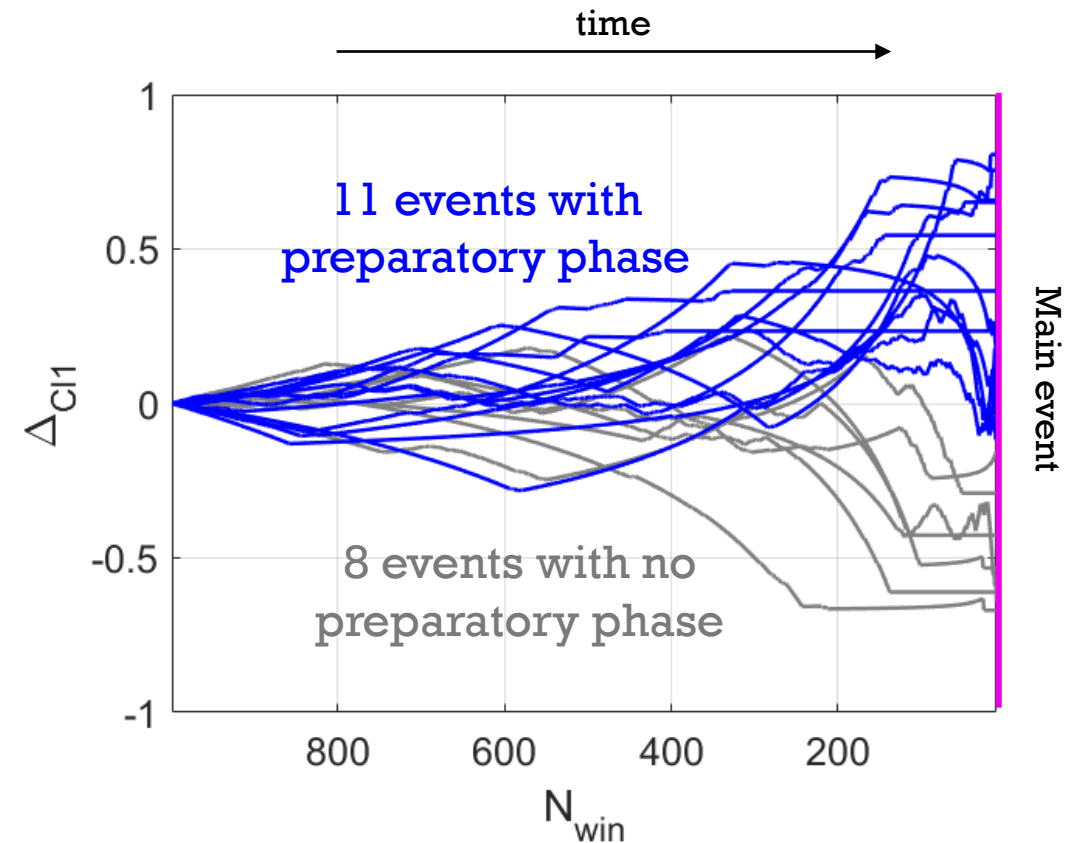


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Finally, we found a preparatory phase for 11 events on 19.



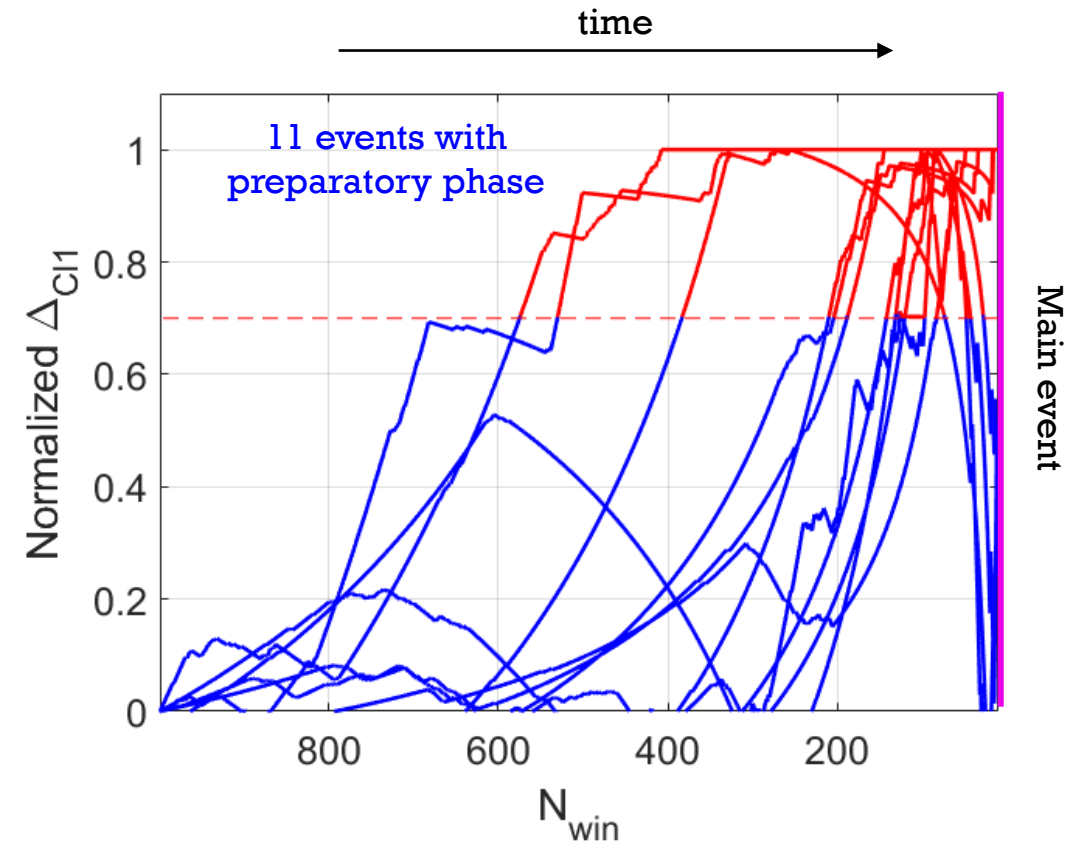
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Finally, we found a preparatory phase for 11 events on 19 with a duration that goes from 14h to 4 days.

We used this results to label the data.

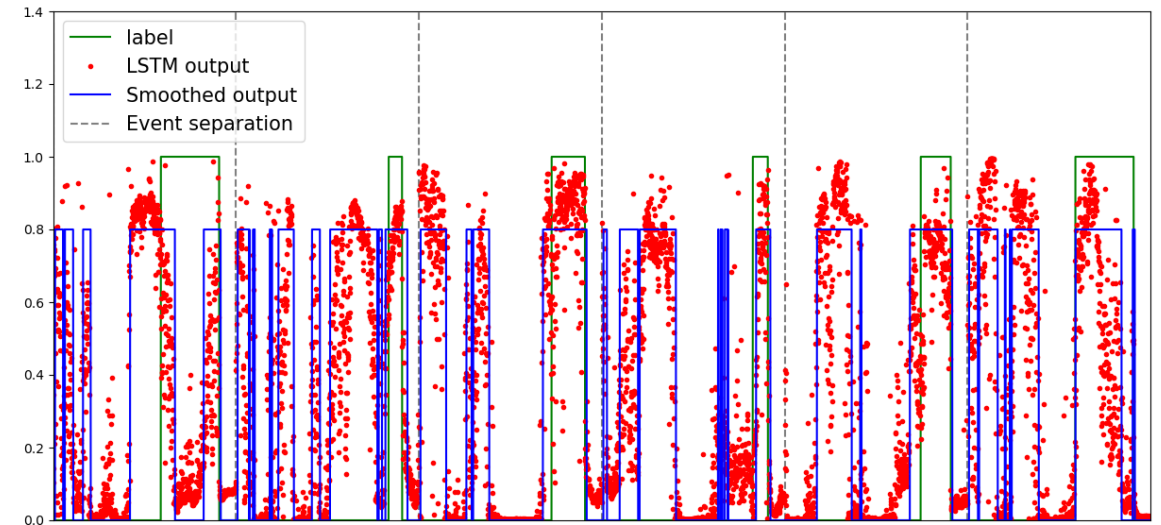
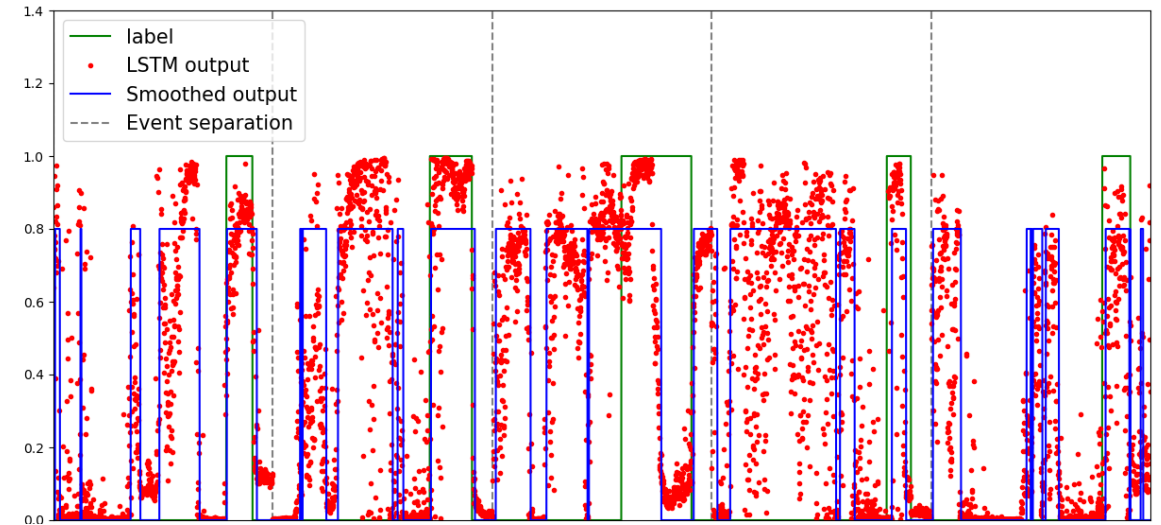


# LSTM ANALYSIS

For this analysis, we divided the 11 labelled events into training (6 events) and testing (5 events) sets.

We tuned the LSTM through cross-validation on the training set and apply the best model.

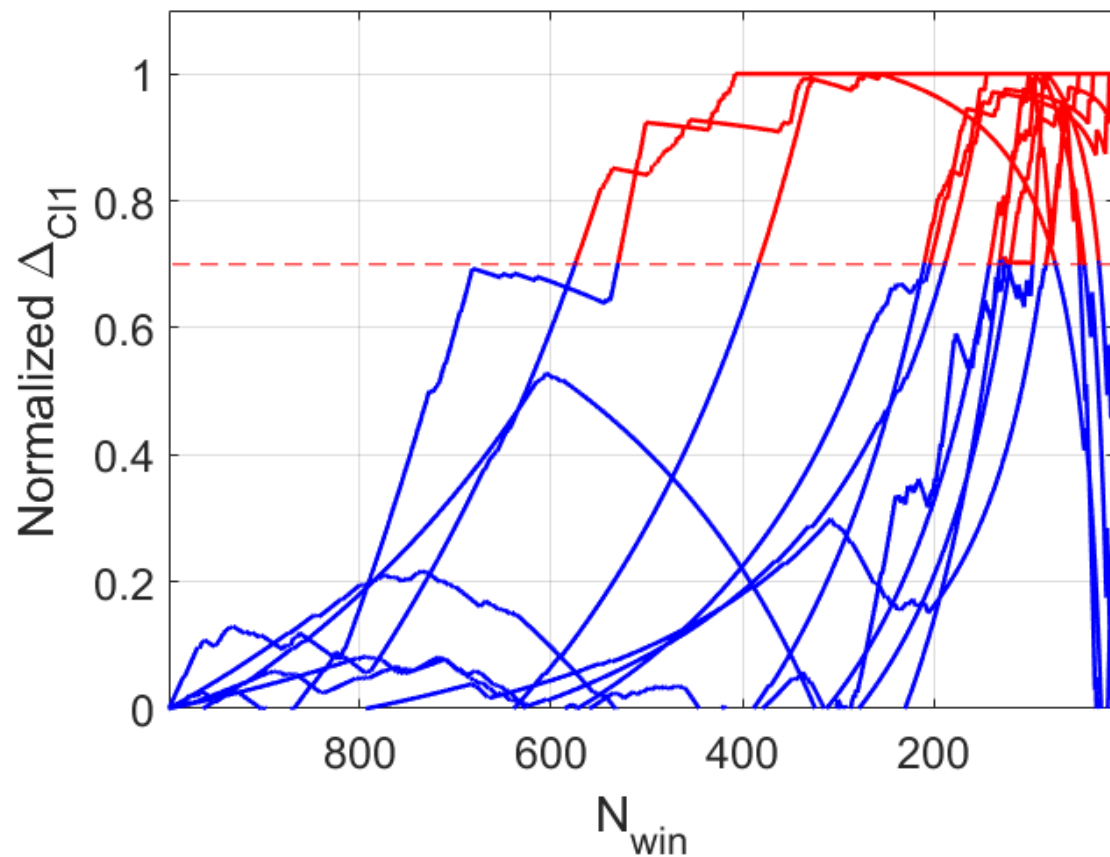
We mostly retrieve the results of the k-mean analysis also on the testing set.





# CONCLUSIONS

- We selected 19 events M3.5+ from The Geysers dataset and looked for the presence of a preparatory process through seismicity-related features
- We maintained the causality of the features performing a moving standardization.
- We firstly used a K-mean clustering, finding that is possible to divide the seismicity into two clusters. We associated one of them to background seismicity and the other to a preparatory phase.
- We find a preparatory process for 11 M3.5+ that goes from 14h to 4 days and used these results to label the preparatory phase.
- Then we used these labelled data into a LSTM recurrent neural network confirming the presence of preparatory process for those events.



**THANK YOU  
FOR THE  
ATTENTION!**