

# Rumination Detection in Dairy Cattle Using Acceleration Based Bolus Sensors

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DairyCare, CERTH, Thessaloniki



# Our Background

- CIDCOM is a research group at the University of Strathclyde within the Department for Electronic and Electrical Engineering
- Strong focus on industrially focussed projects related to sensors, edge computing, data analytics and machine learning
- Several current projects in the area of dairy cows (welfare, milk optimisation, and tracking)

# Reticulorumen Activity Monitoring

- Movement of bolus based sensors for detecting temperature/pH may provide insight into animal health in a similar manner to collar based sensors
- Combination of movement and temperature in single package is desirable
- First stage was to see what rumen activity looked like and then aim to develop a model related to behaviour

# Testing Facility

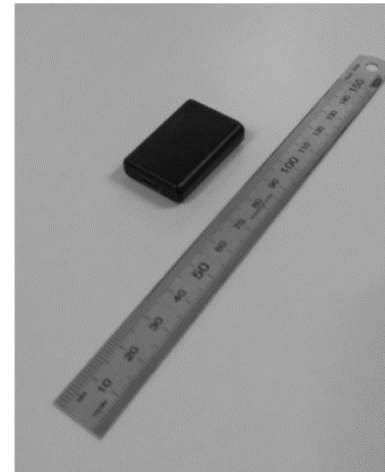
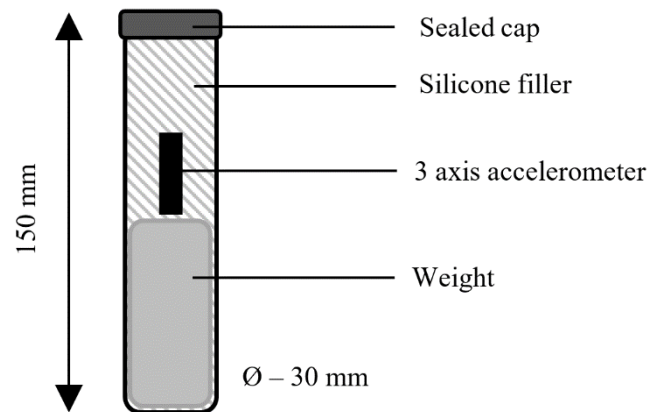
University of Glasgow's research facility Cochno in North-West of Glasgow used by animal scientists and vets

Total of 6 cows were used for the test over a 60 day period



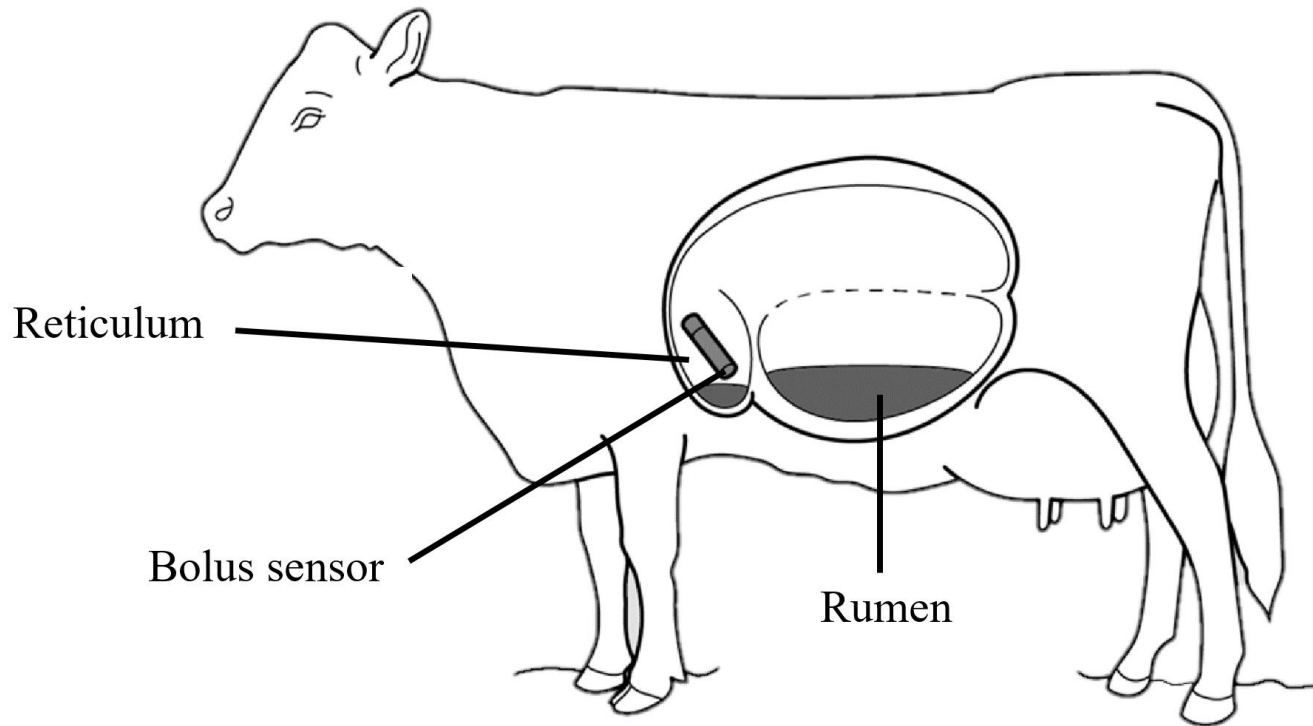
# Bolus Sensor

Sensors used local storage for data and was retrieved from the bolus after experimental period



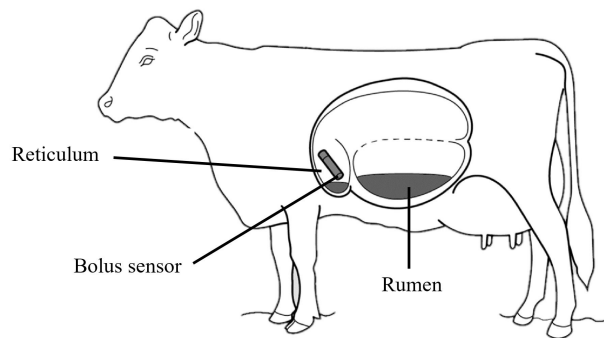
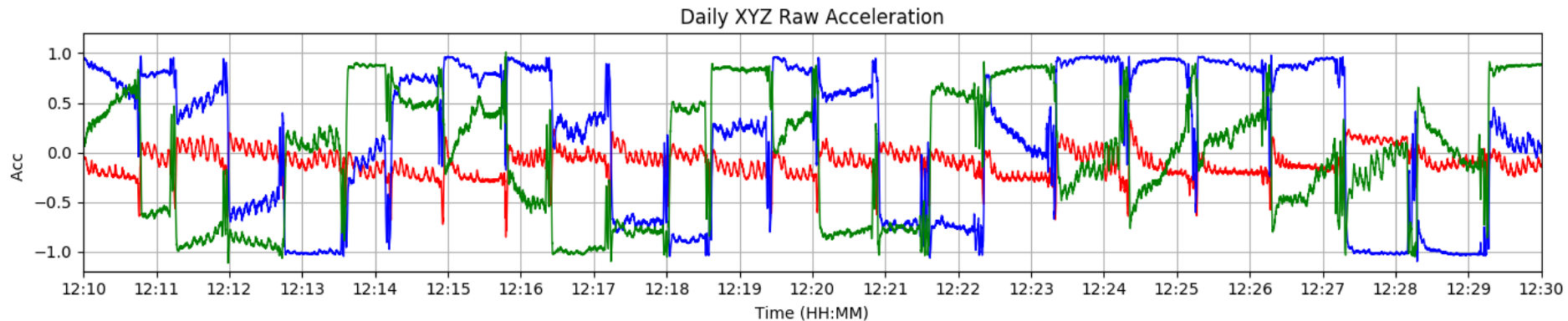
Sensors were inserted into and retrieved from the cows via a cannula to the rumen

# Bolus Sensor



# Raw Acceleration Data

3 axes acceleration with range of +/- 1 g  
X,Y, Z – red, blue, green, respectively

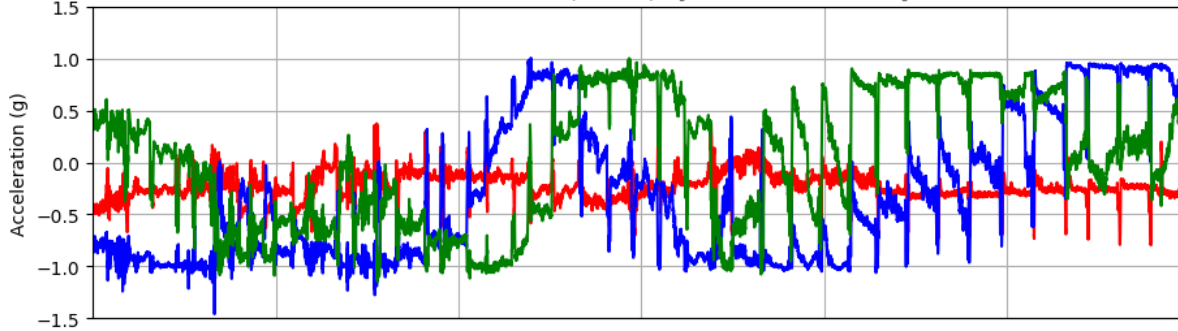


Bolus would occasionally have very low data likely due to movement between reticulum and rumen

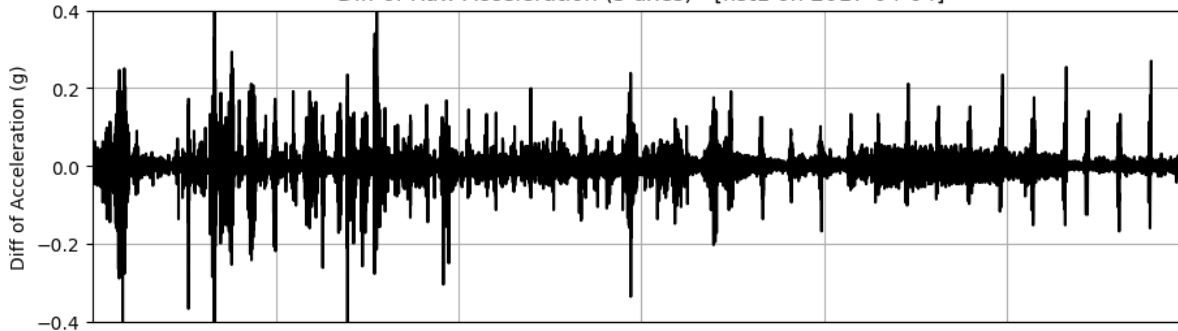


# Resolution to Activity

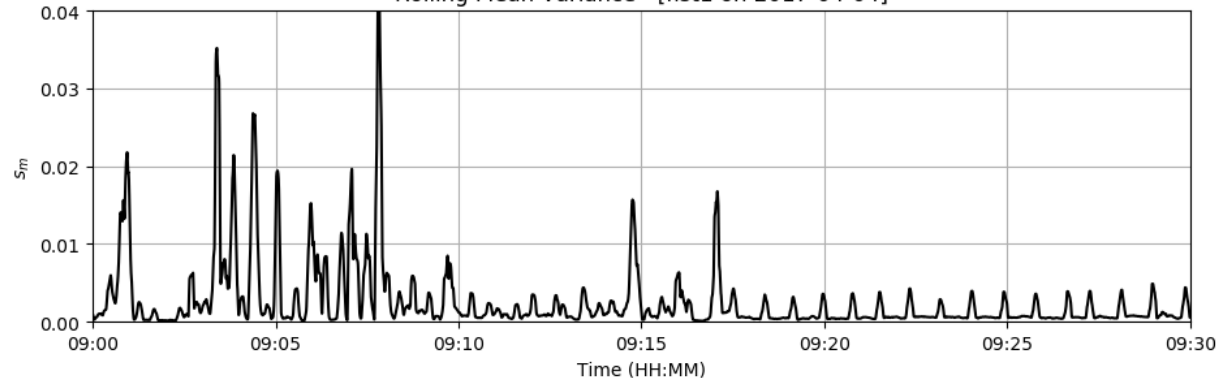
Raw Acceleration (3 axes) - [fist1 on 2017-04-04]



Diff of Raw Acceleration (3 axes) - [fist1 on 2017-04-04]



Rolling Mean Variance - [fist1 on 2017-04-04]

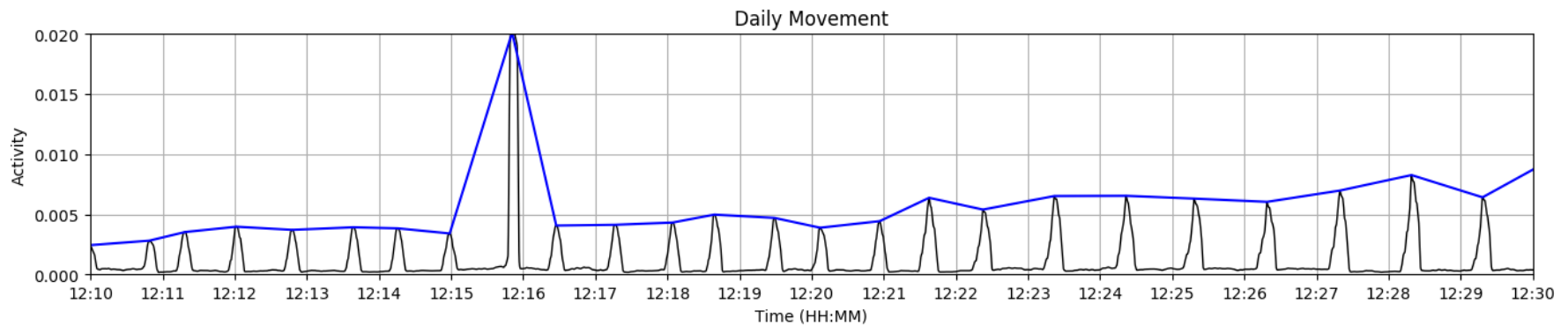
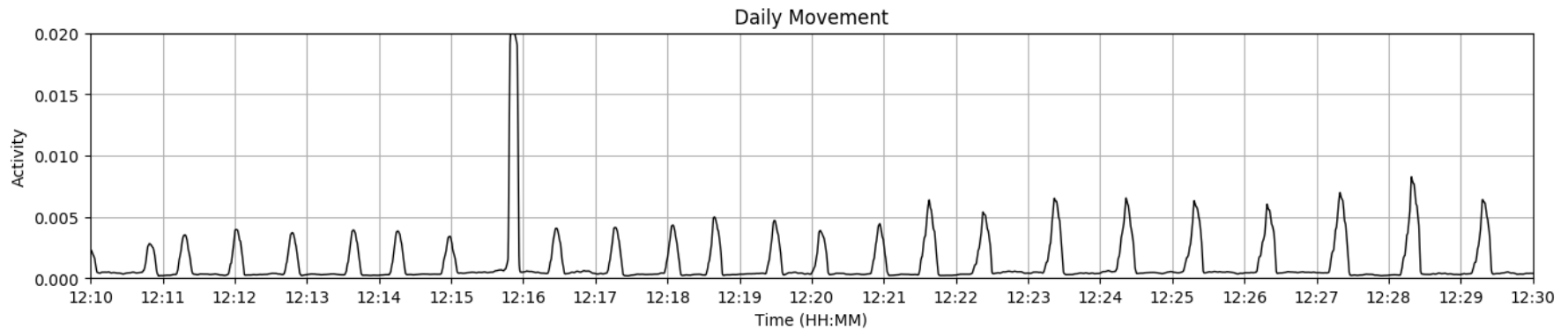


2 stage filter was used to create measure of mean variance of the combined X,Y and Z accelerations

Filter was based on the sampling frequency and was optimised to remove low level peaks through zero-crossing thresholds

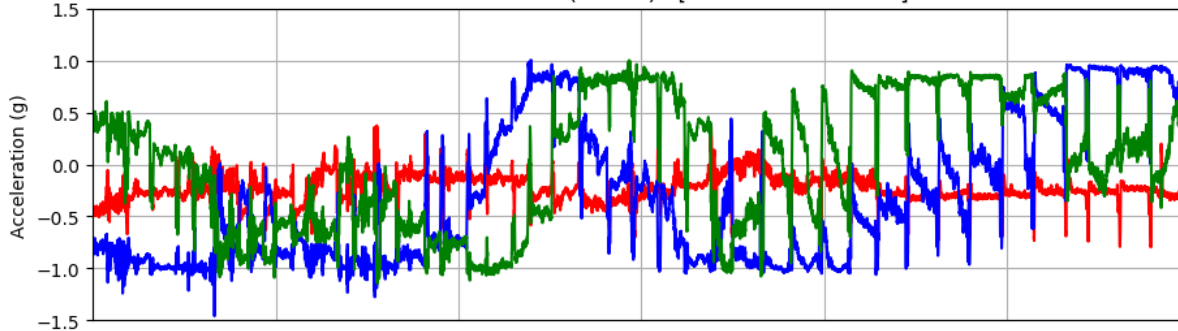


# Detection of Peak Strength and Time Between Peaks

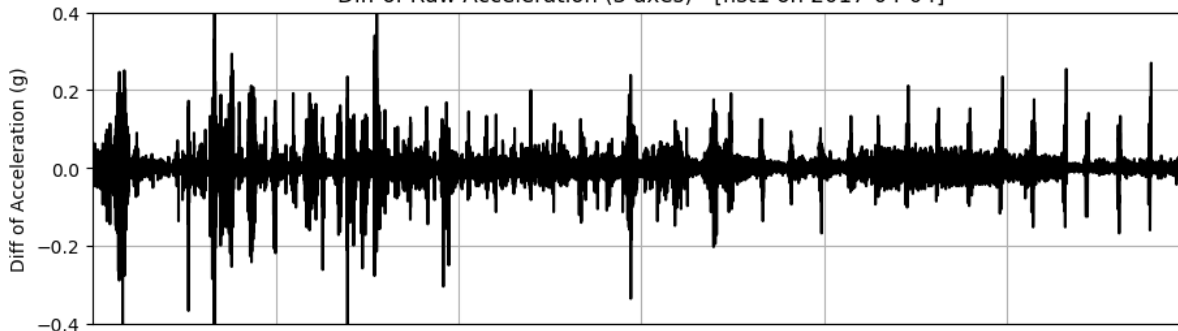


# Relationship to Behaviour

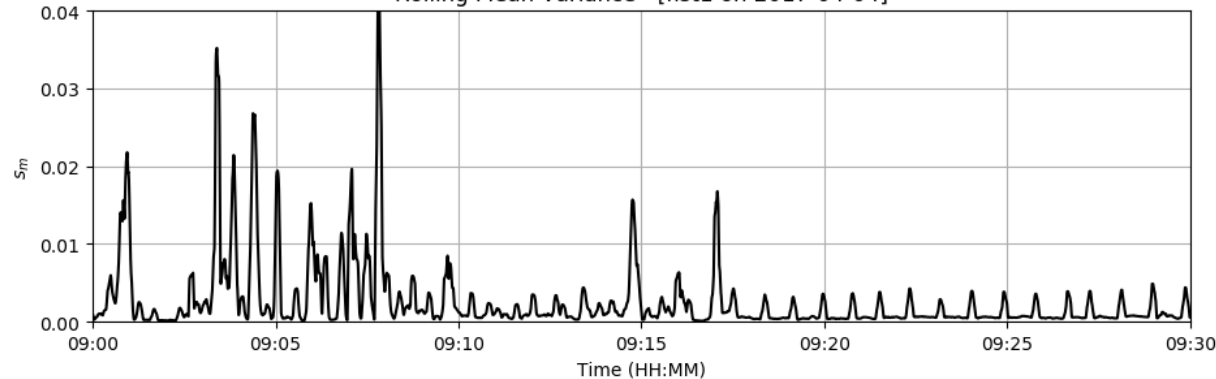
Raw Acceleration (3 axes) - [fist1 on 2017-04-04]



Diff of Raw Acceleration (3 axes) - [fist1 on 2017-04-04]

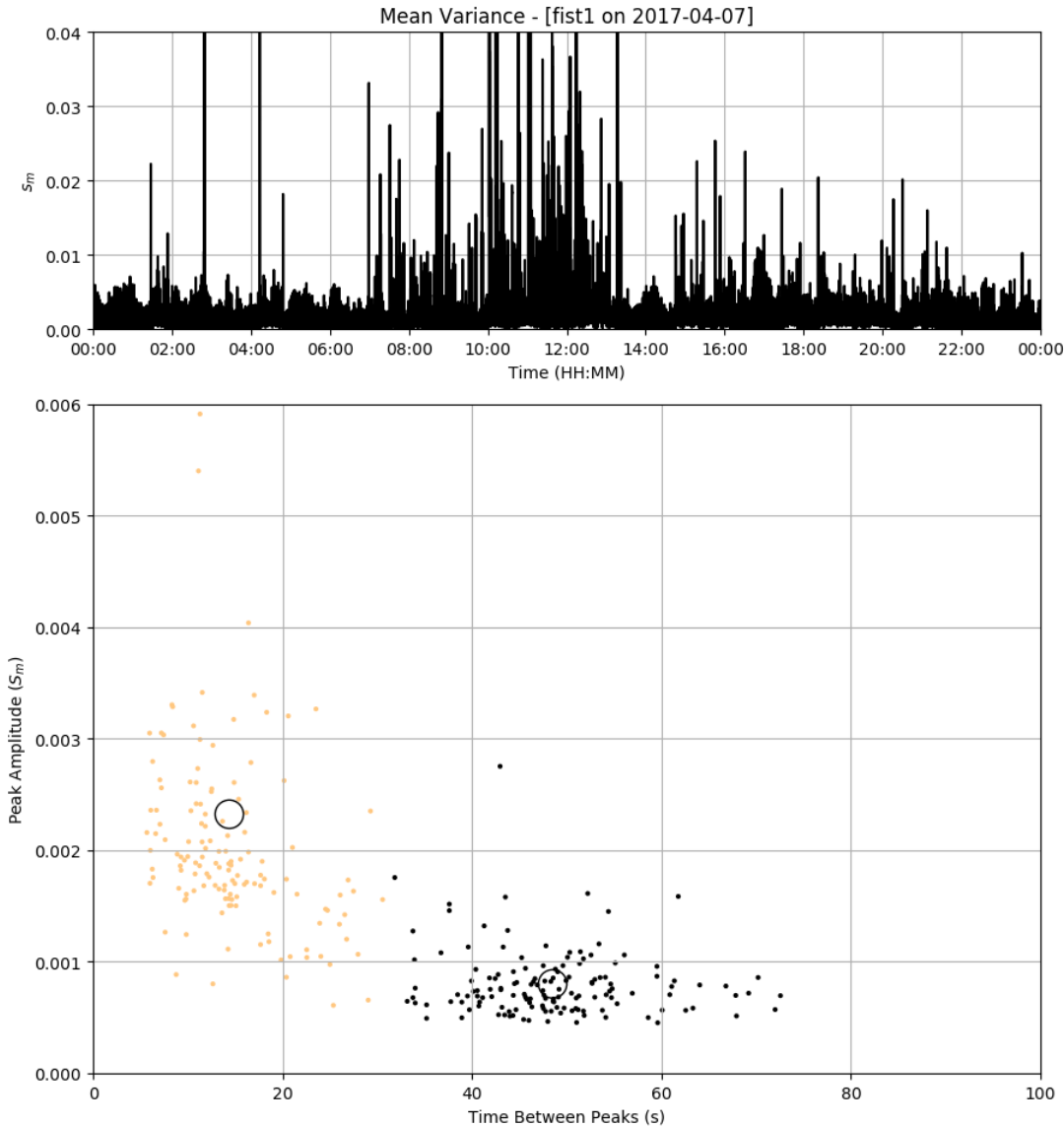


Rolling Mean Variance - [fist1 on 2017-04-04]



Time between peaks and the amplitude of each peak indicated distinct regions

# Clustering Analysis



Each cow data set was broken into 24 hour periods

The mean peak amplitude and time between peak over 5 min segments was used to generate cluster plots

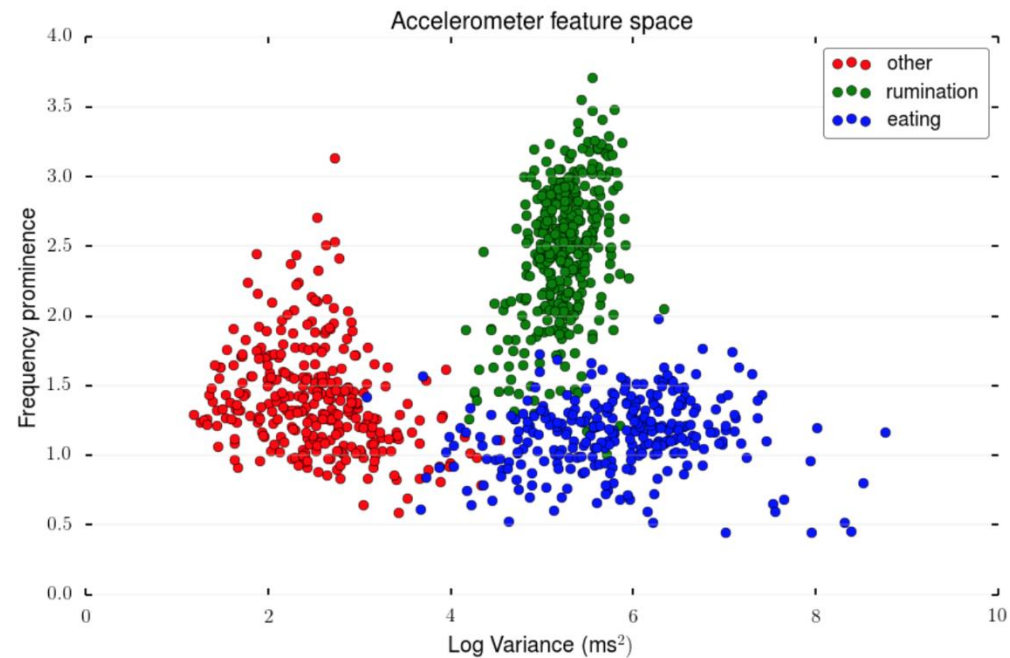
K-Means analysis with silhouette to verify optimal cluster #

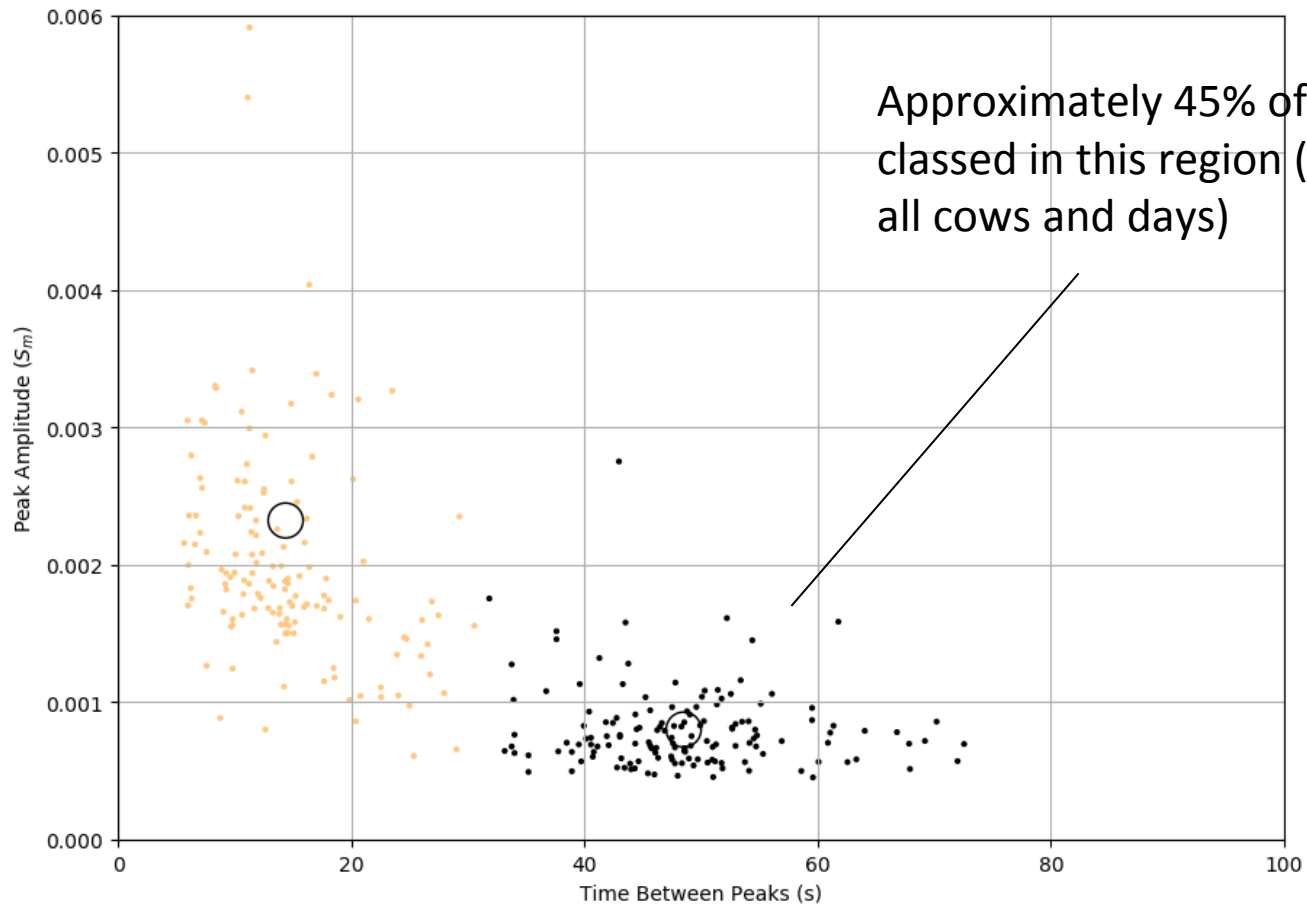
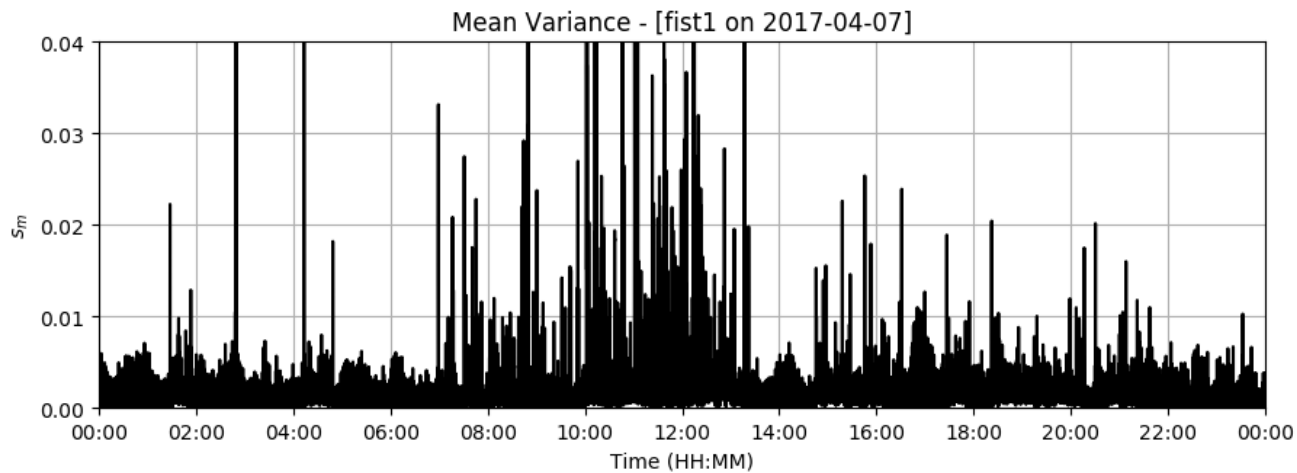
2 clusters proved most stable with successive analysis

Area of interest is the bottom cluster that seemed to correlate with rumination period of 40-50s

# Verification with Collar Data

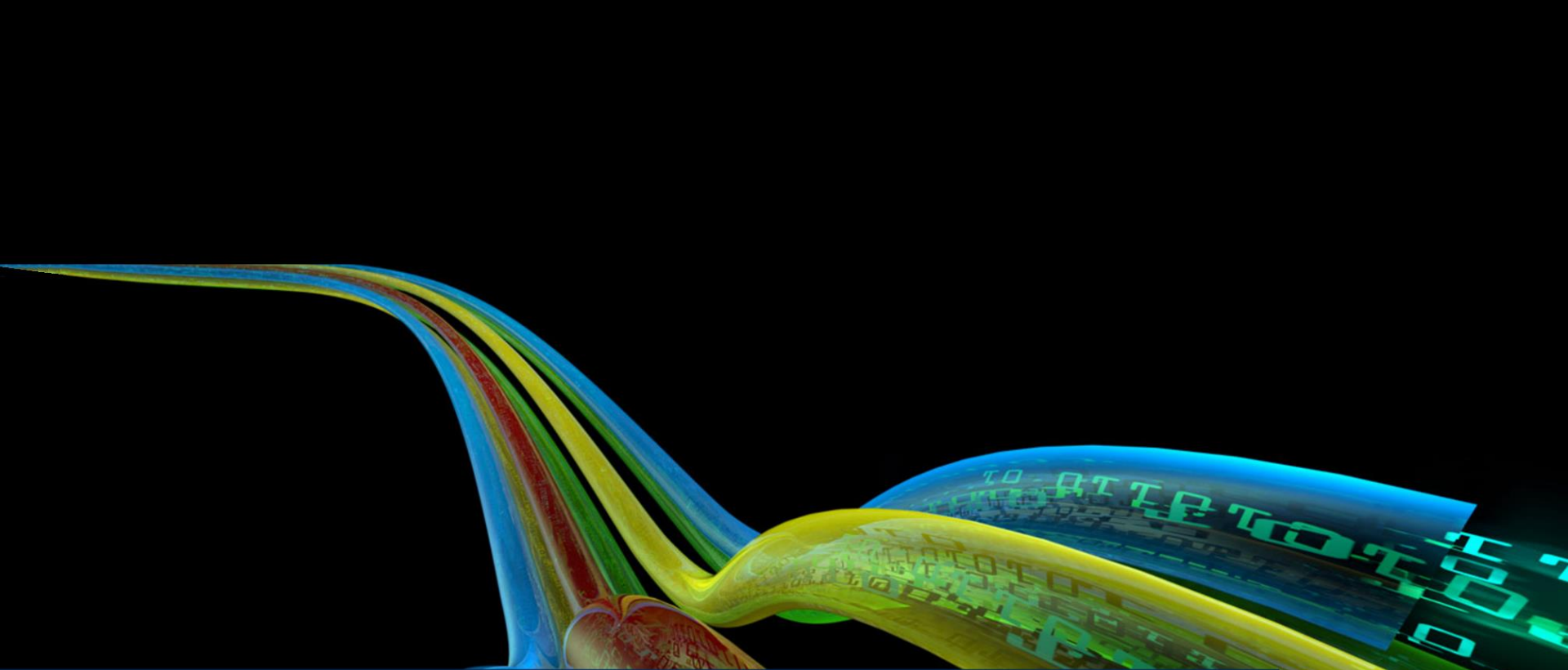
- Cows that were instrumented with bolus sensors and collars were used to verify model
- These collars used a 3 state classification of eating, rumination and other
- Dairy cows will spend approximately 1/3 in each state





# Conclusions

- Derivation of a 2 state model of the reticulorumen with 1 cluster strongly correlated with rumination
- Cluster contains other movement that is not rumination, requires further analysis to discriminate further (principle component analysis, etc)
- Sensor design requires refinement to reduce incidence of movement between reticulum and rumen



Electronic & electrical engineering

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