



*Mountain bike predictive  
analytics from your smartphone*

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## Problem & Opportunity

*\$6B / year*

*US Bike industry value*

*20M / year*

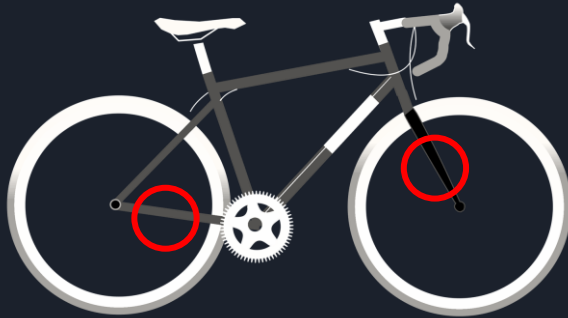
*Bikes sold in the US*

- Bicycle components will wear down and eventually fail
- Professional repairs are expensive and time-consuming
- Riders are enthusiastic but lack skills and information to do early maintenance

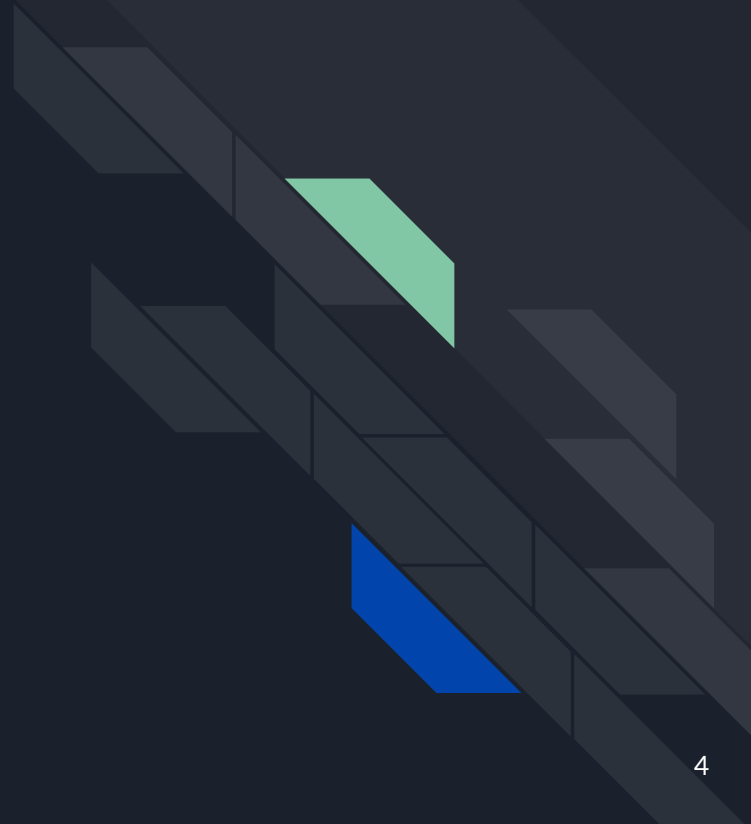
# Rumble Solution

Rumble will use **smartphone readings** and **machine learning** to provide riders with predictions on health of components. Before or after a ride:

- Guides user through process
- Identifies problem areas
- Connects them to resources



# Feature Engineering & Extraction



# Feature Engineering & Extraction

## *Time Domain*

1

Trim noise

2

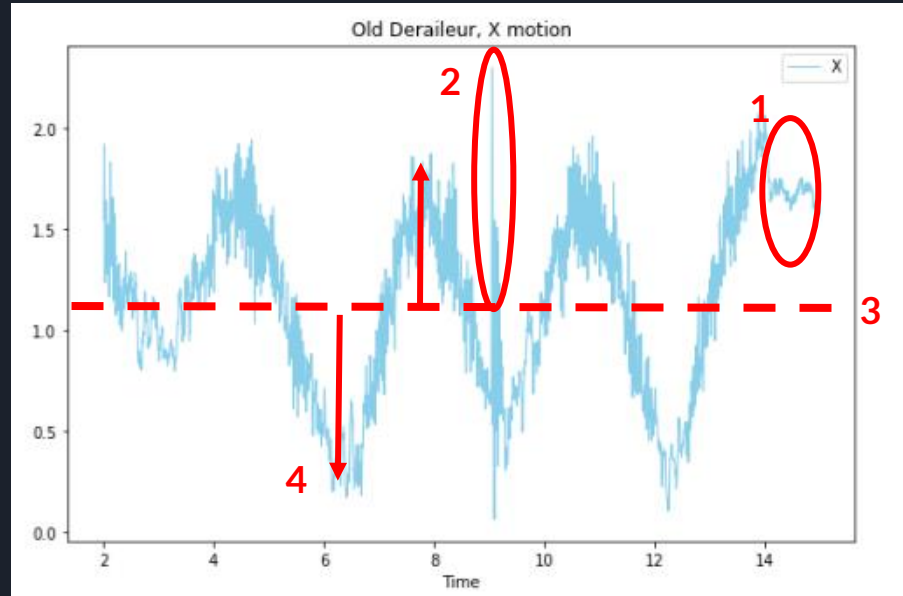
Outliers

3

Average power

4

Variance & skew



# Feature Engineering & Extraction

## *Frequency Domain*

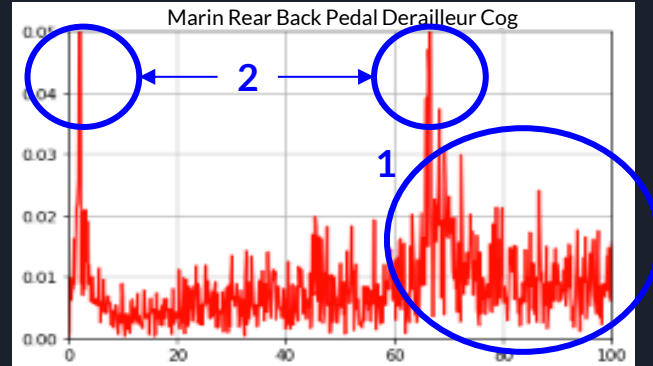
1

**Average  
magnitude**

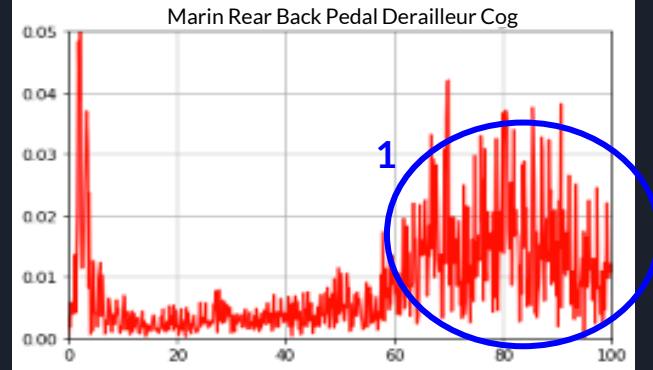
2

**Dominant  
frequencies**

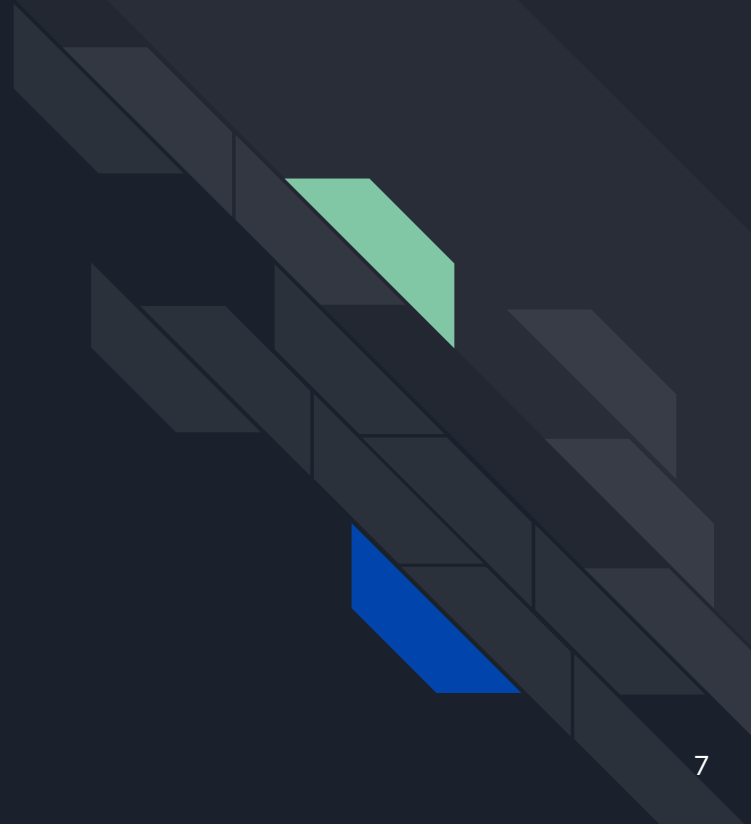
*Not  
Broken:*



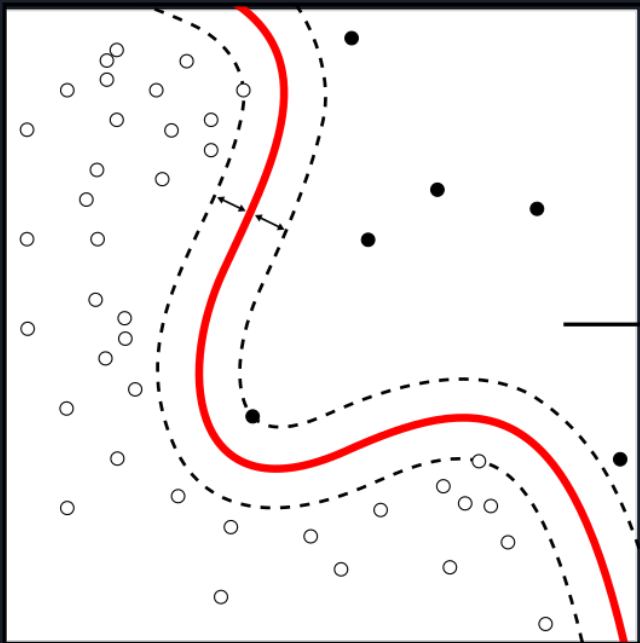
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# Machine Learning Engine



# Support Vector Machines (SVM)

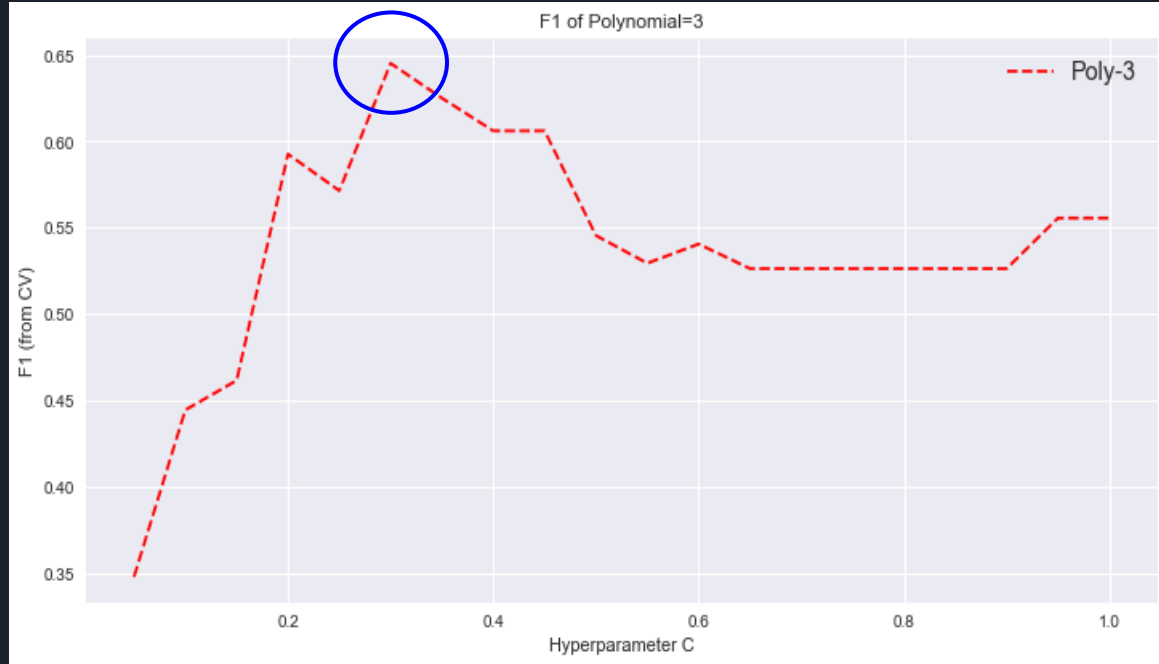


1. Robust to small, imbalanced datasets and numeric features
2. Model different relationships
  - a. Linear
  - b. Polynomial Kernel
  - c. Radial Basis Function (RBF)
3. Parameter tuning  $C$
4. Evaluate generalization



# Model Development Process: *Derailleur Cog Example*

1. *Broken DC* (N=15) vs. rest (320)
2. Balance SVM class weights
3. Select and scale key features
4. Train each SVM variant using leave-one-out cross-validation
5. Gridsearch over  $C$
6. Select best performer/  
consider ensembling





# Evaluation of Component Models

Component	$N_{\text{broken}}$	SVM	Precision	Recall	F1-score
Rotor	99	RBF	56.0%	84.8%	67.5%
Chain	71	RBF	68.7%	80.3%	74.0%
Wheel Bearings	64	RBF	56.8%	78.1%	65.8%
Steering Head	15	RBF	63.6%	93.3%	75.7%
Derailleur Cog	15	Ensemble (poly+RBF)	52.4%	73.3%	61.1%



# Minimum Viable Product (MVP)

1 Capture cell phone readings

2 Upload to website

3 Make model predictions

## Viability

- Does it classify?
- Does it generalize?

## Utility

- Is it simple to use?
- Is it valuable to the user?



# Live Demo

# MVP Testing Results

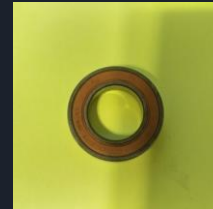
## Deraillieur Test

- Rumble correctly identified a deraillieur problem
- Chain was incorrectly threaded through the deraillieur



## Back Wheel Bearing Test

- Rumble correctly identified a back wheel problem
- Bearings were corroded (even the bike shop gave the OK)





# Future Development Roadmap

**User Experience & Design**

**Models & Predictive Power**

**Community Development**

**Extension to Other Industries**



# rumble

Questions?

