

TANZANIA MINISTRY OF WATER

# PREDICTING THE CONDITION OF WATER PUMPS IN TANZANIA

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A Presentation by Patrick Anastasio





**We believe in a world where  
every single person has access  
to clean and safe water**

# Problem

- Tanzania is a developing country with varying geography and access to natural resources
- Water is a scarce resource
- Over 59,000 pumps have been installed
- Maintenance is regularly required

# Task

Create a model to predict the condition of a well;  
Functioning or Non-functioning

- Strategically locate repair teams
- Mobilize quickly when resources and repairs are needed
- Supply needed potable water to villages whose pump is non-functional until repairs can be done

# Data Understanding

The data set is provided by Taarifa which aggregates data from the Tanzania Ministry of Water on the over 59,000 water pumps

## Method:

- Determine relevant features for prediction
- Create several models and look for best predictor metrics
- Use validation methods to ensure performance
- Tune final model for optimal predictions



# Model Selection

False Positive –  
predicted as non-functional  
but is functional

False Negative –  
predicted as functional but is  
non-functional

## Maximize Recall / TPR

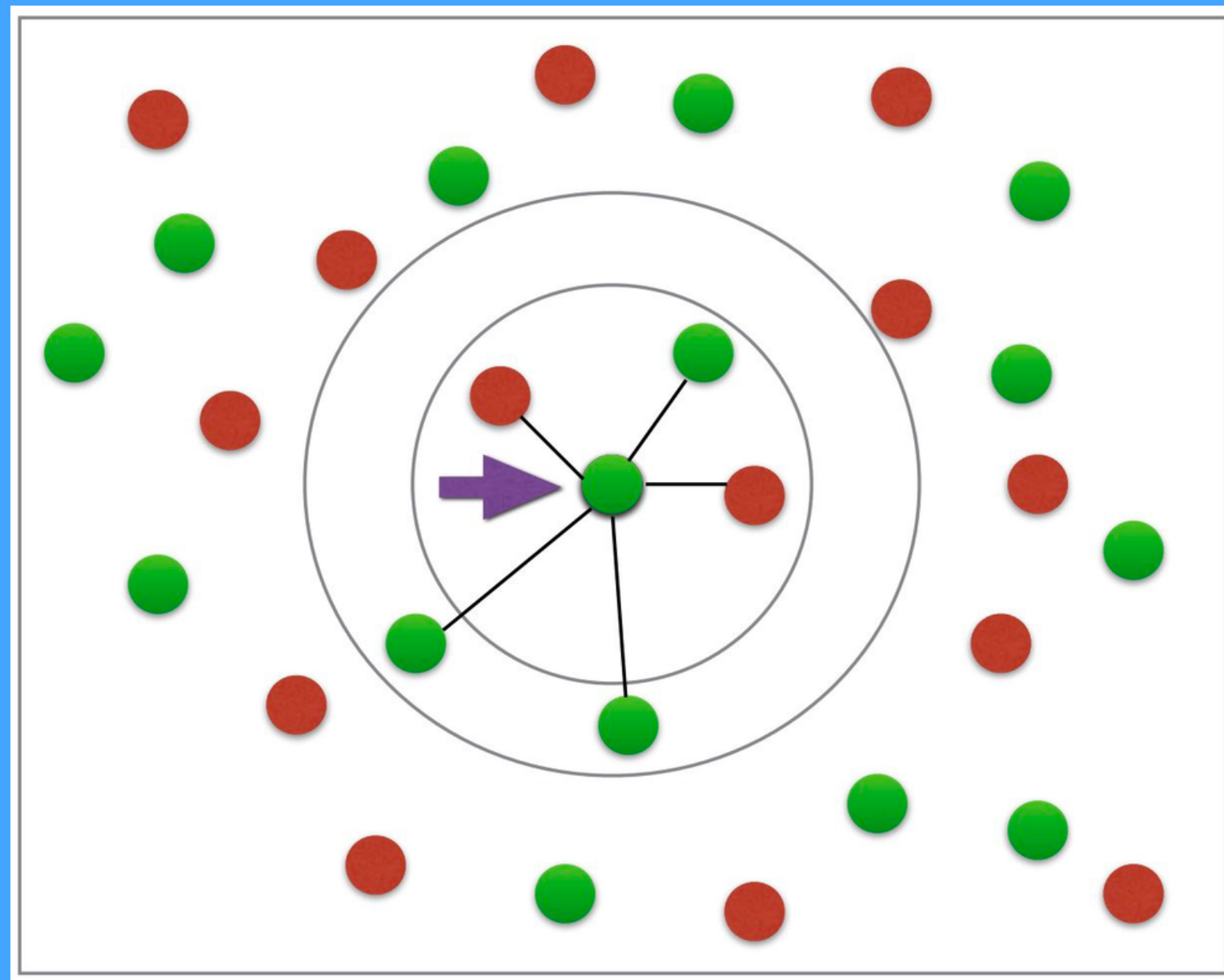
- Minimize false negatives
- Resources are directed to the people who need them
- More human lives are saved

## Maximize Precision

- Minimize false positives
- Resources are not directed where they are not needed
- Less logistic strain on the system
- Resources not spread too thin

## Inverse Relationship

# K NEAREST NEIGHBOR



Most common class  
among a datapoint's  
"K" number of nearest  
neighbors

"K" must be odd

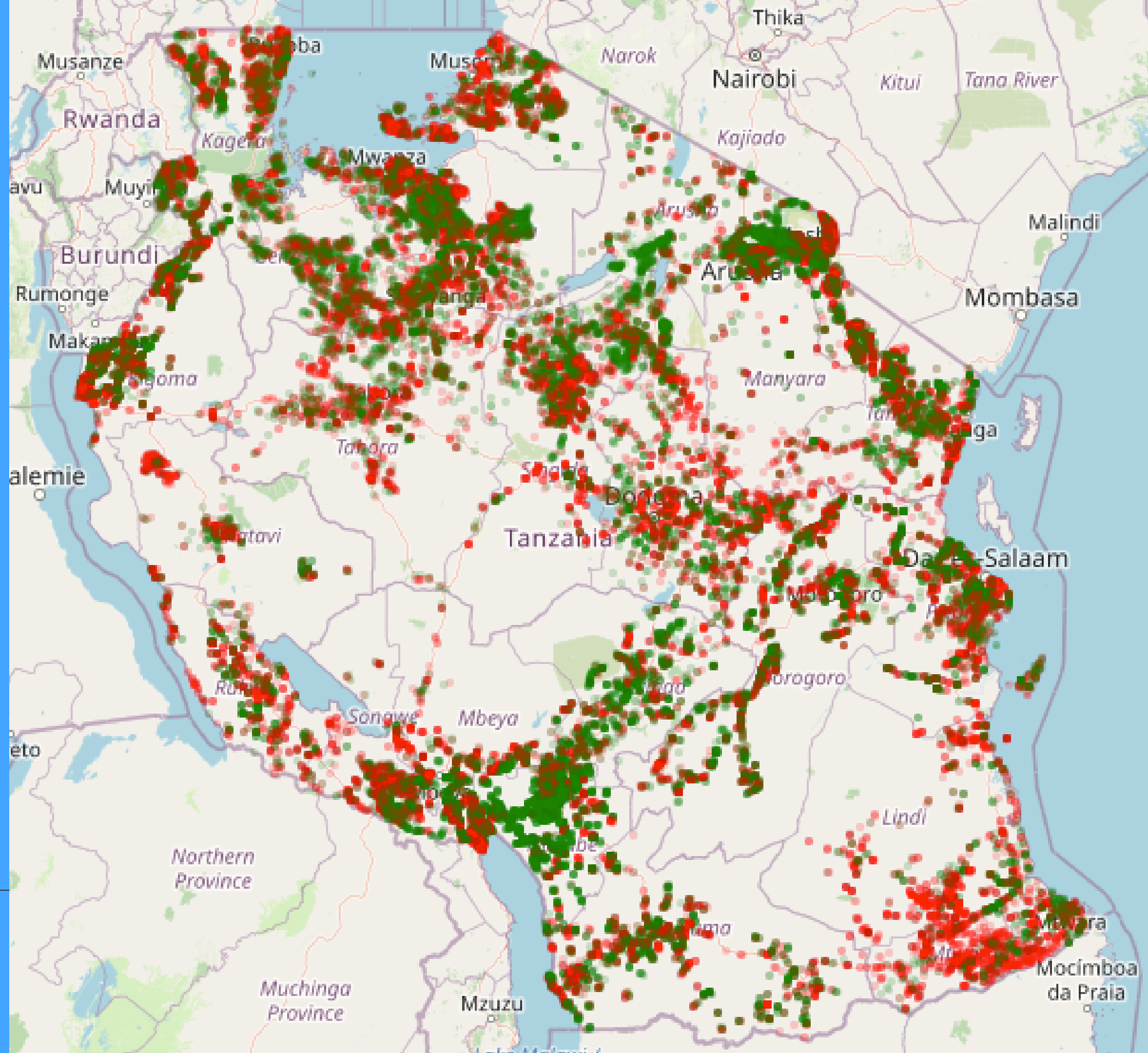
Default is 5

# Current Pump Condition

● Functional

● Non-functional

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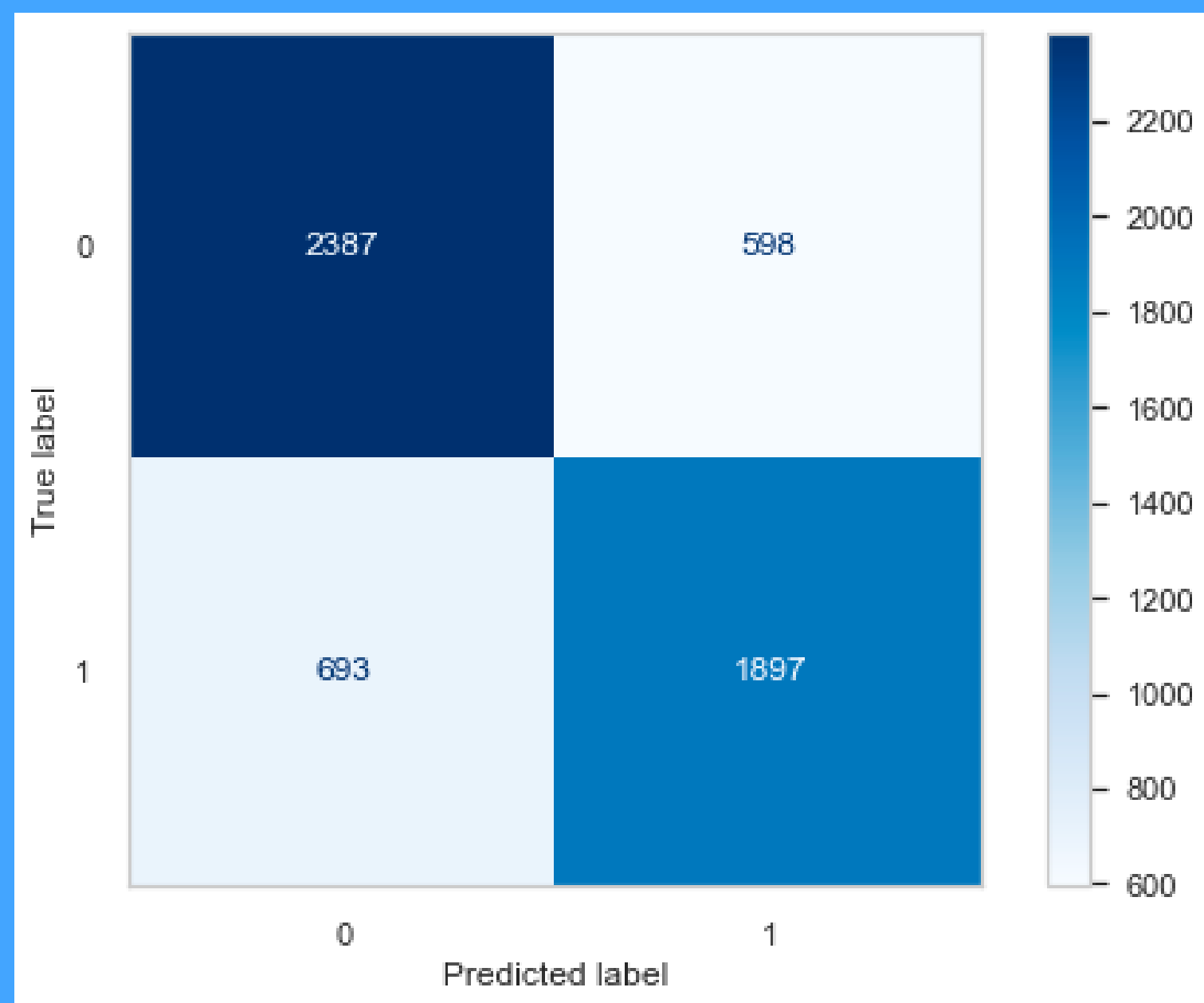




# FINAL MODEL

## K Nearest Neighbor

Best Parameters\*: (n\_neighbors = 5, metric = 'distance')



0 – Functional    1 – Non-functional

- Recall : 0.7324 (+1.89%)
- Precision: 0.7603 (-0.74%)

Actual Non-functional wells are being accurately predicted at a rate of 73.24%

\*TUNING RESULTS WERE NOT SENSITIVE TO LEAF\_SIZE

# RECCOMENDATIONS

- Track seasonal droughts, water conditions and basin levels
- Know what non-functional pumps are un-repairable to better target efforts
- Install more pumps
- Gather more data

# NEXT STEPS

- Gather more data
- Re-assess features for significance
- Further tune the model
- Assess more advanced and resource intensive models

# Q & A

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