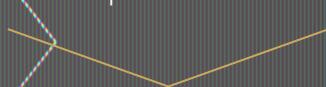


# COVERED IN BEES!!

Exploring causes of colony  
loss and the predictive  
power of data



# COLONY COLLAPSE

Documented back to 1869

Disappearing disease

Spring dwindle

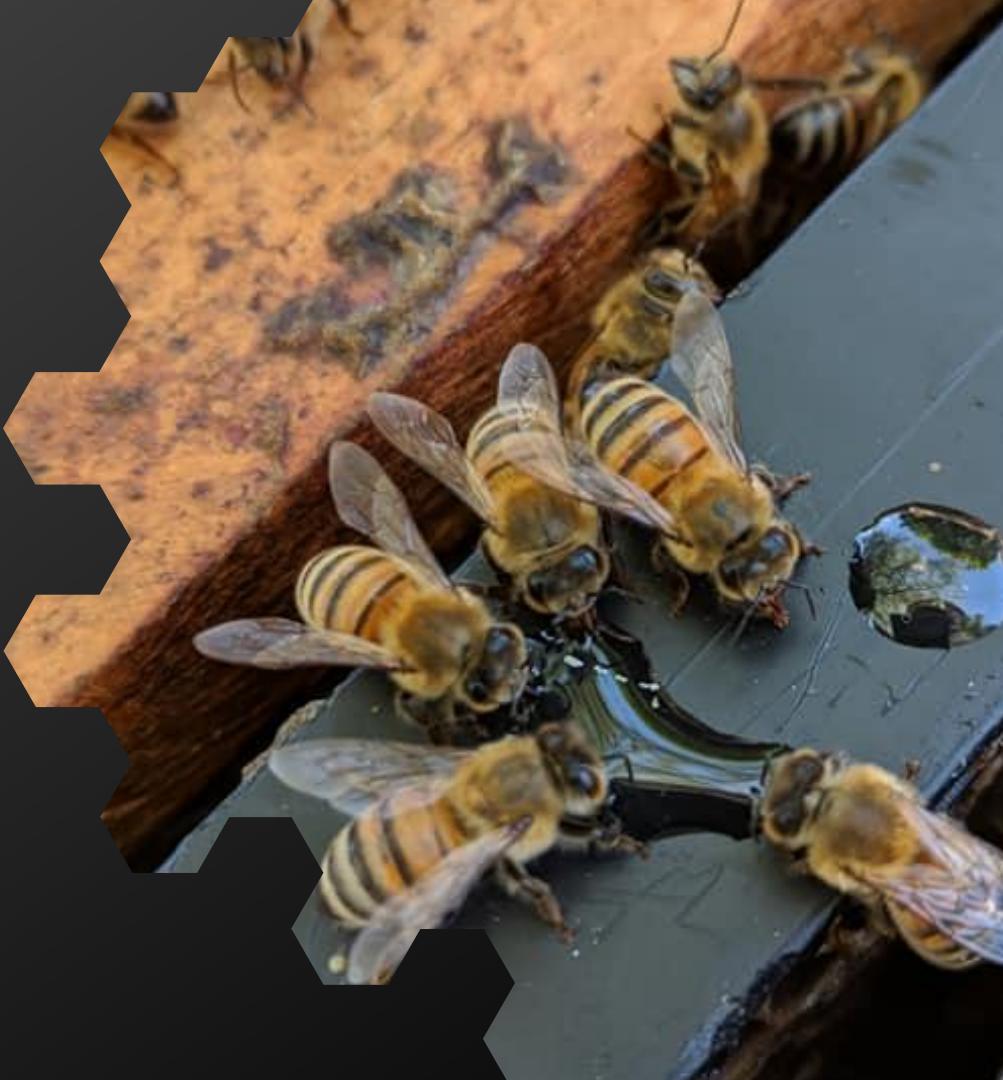
May disease

Autumn collapse

Fall dwindle...

Named colony collapse disorder  
as of 2006, when attrition climbed  
dramatically

The USDA has been keeping data  
on bees since 2015.



# REAL ECONOMIC IMPACT

FOOD 

Almonds & Avocados

 INDUSTRY

Cotton & Timber

SANITY

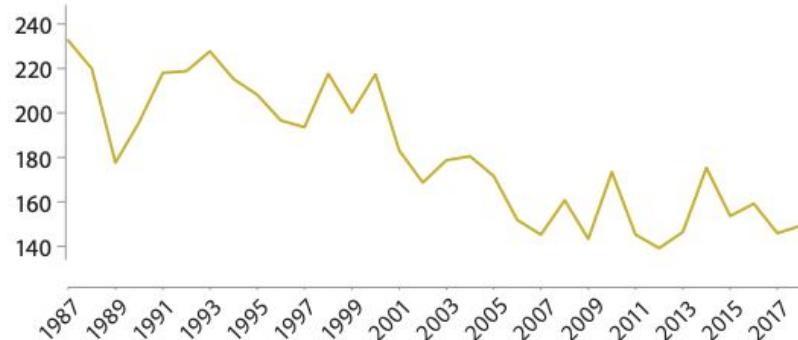


Coffee & Tea & Wine

 MEDICINE

Aspirin & Morphine

**Fig. 3. U.S. Honey Production, 1987 – 2018 (million pounds)**



Source: USDA NASS, *Honey Report* (various years).

# WHAT DATA DO WE HAVE?

## SEASONAL COUNTS

Starting colony and lost colony numbers

01

## CAUSES OF DEATH

Varroa mites, pesticides, other diseases, pests, and “unknown”

02

## WHERE AND WHEN

State, year, quarter.  
Plus, extrapolated  
region and subregion

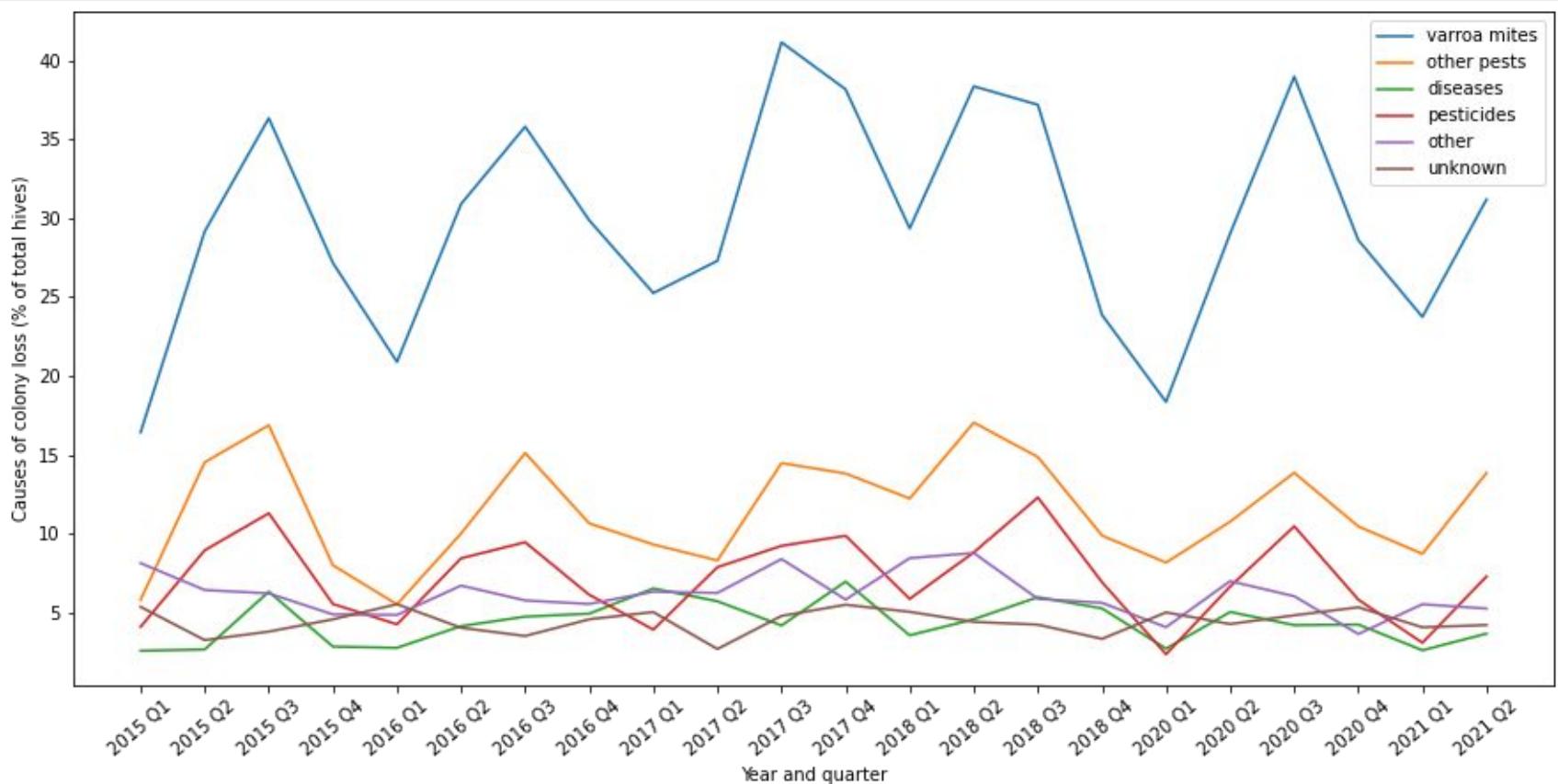
03

# ABOUT THE PROJECT

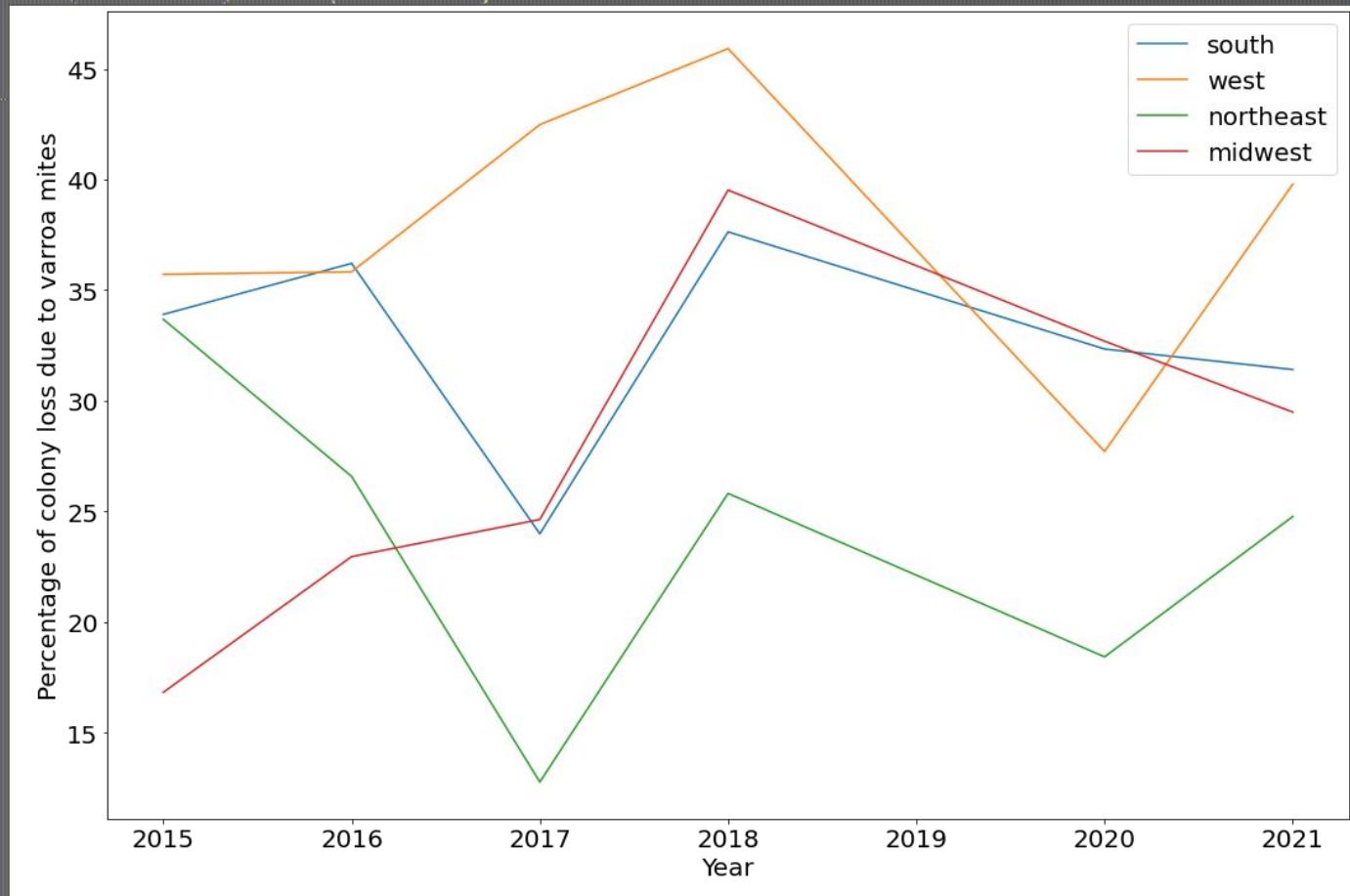


Is it possible to predict the largest  
contributors to colony loss with the data  
available and, if so, what are those  
predictors?

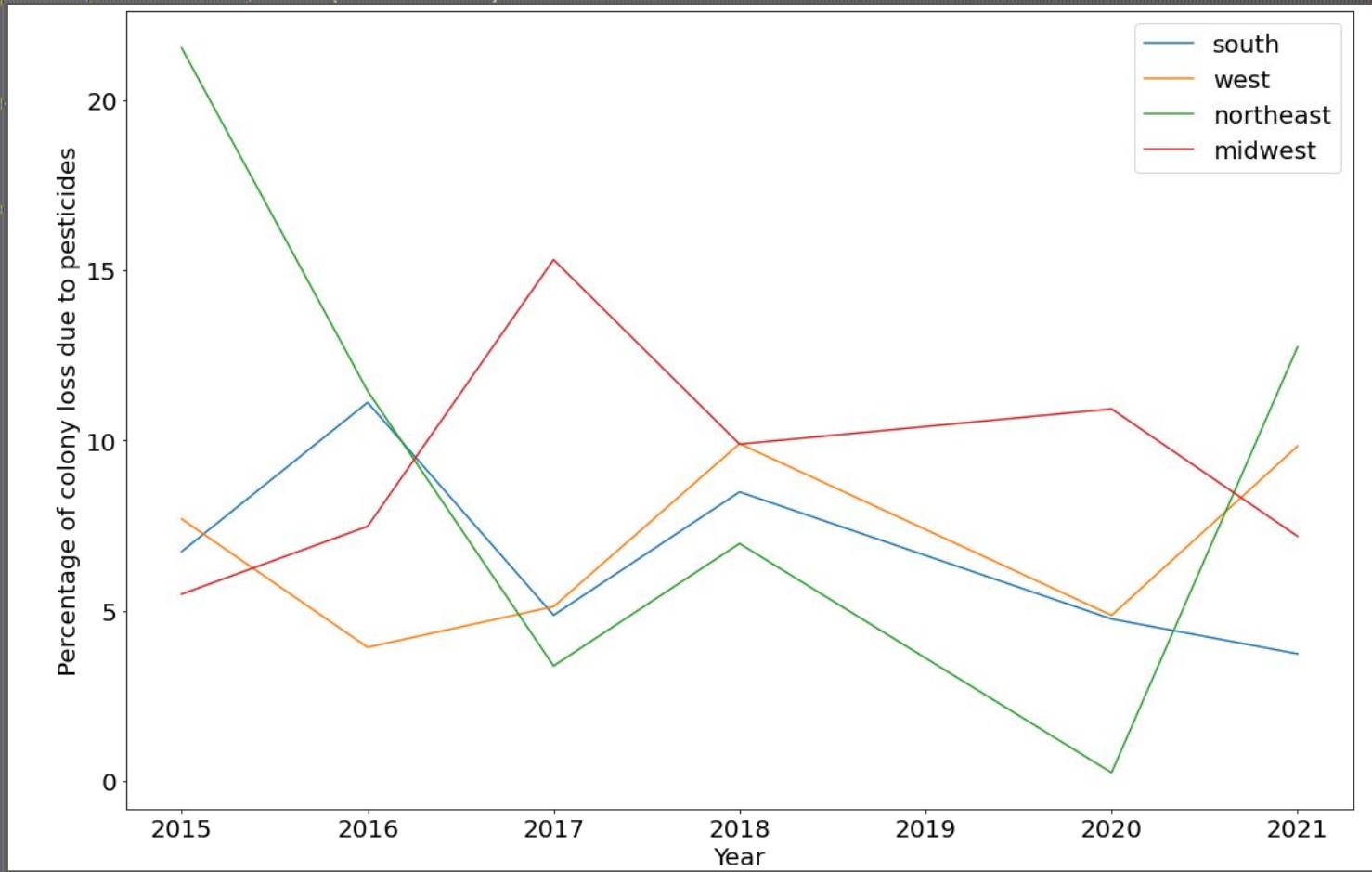
# STRONGLY SEASONAL DATA



# NO OBVIOUS PATTERNS



# NO OBVIOUS PATTERNS



# PREDICTION ENGINE



# ABOUT THE ANALYSIS

RIDGE  
REGRESSION

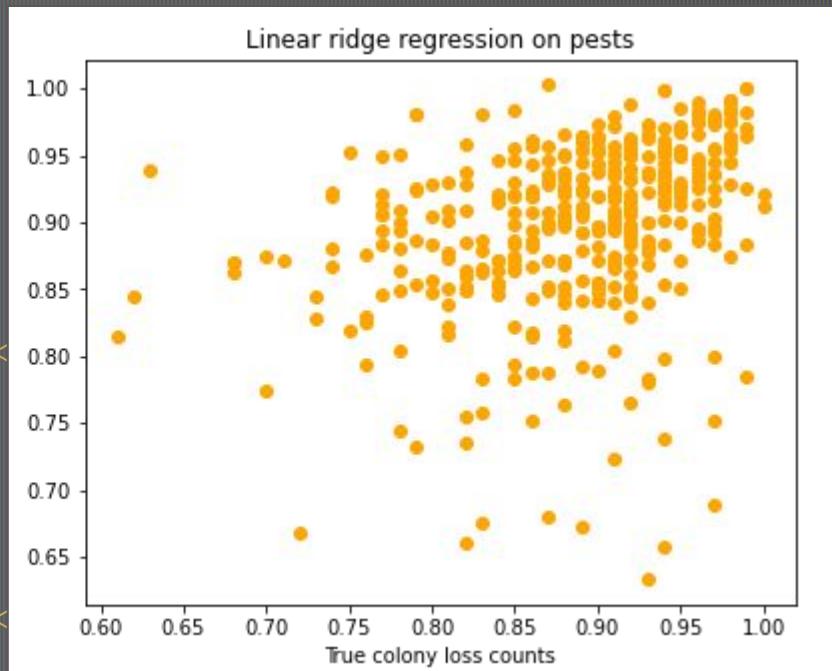
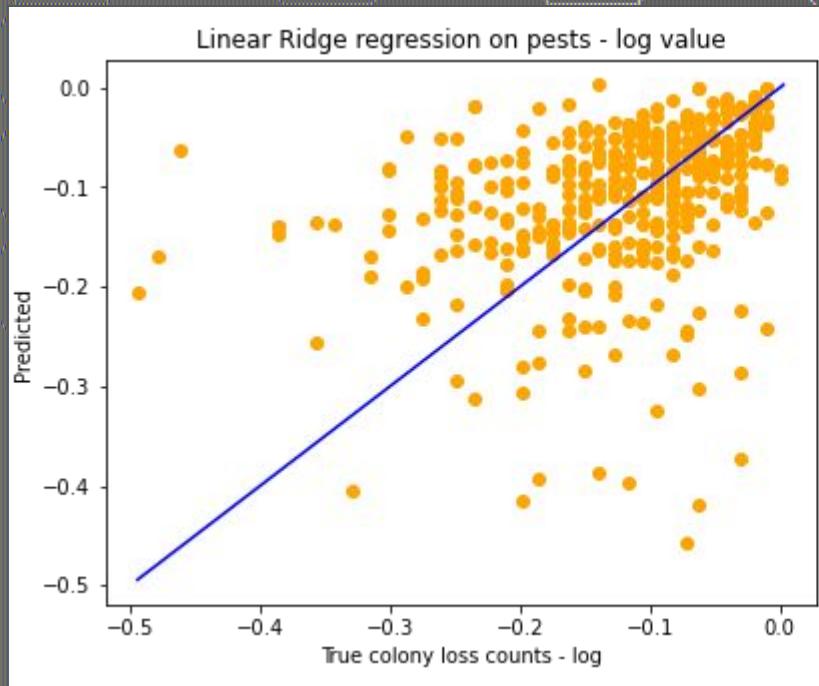
A sub-type of linear  
regression good for  
sparse data

RANDOM  
FOREST

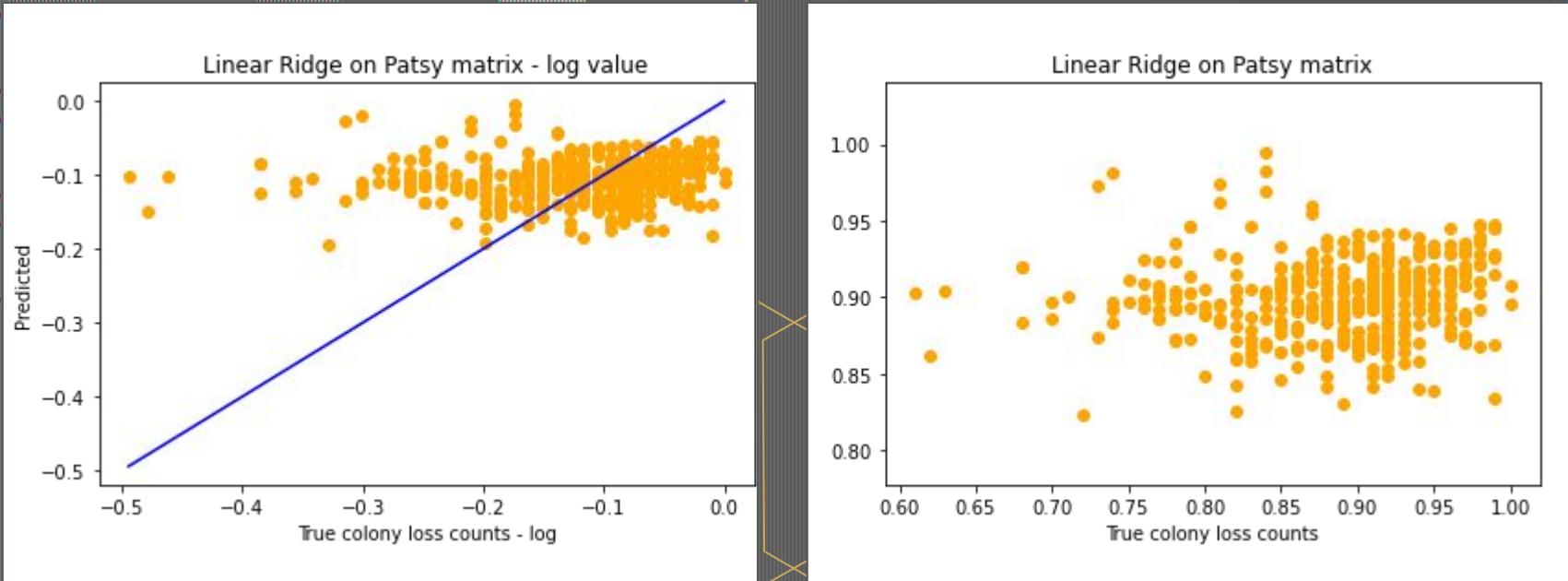
A lot of decision trees

SUPPORT  
VECTOR

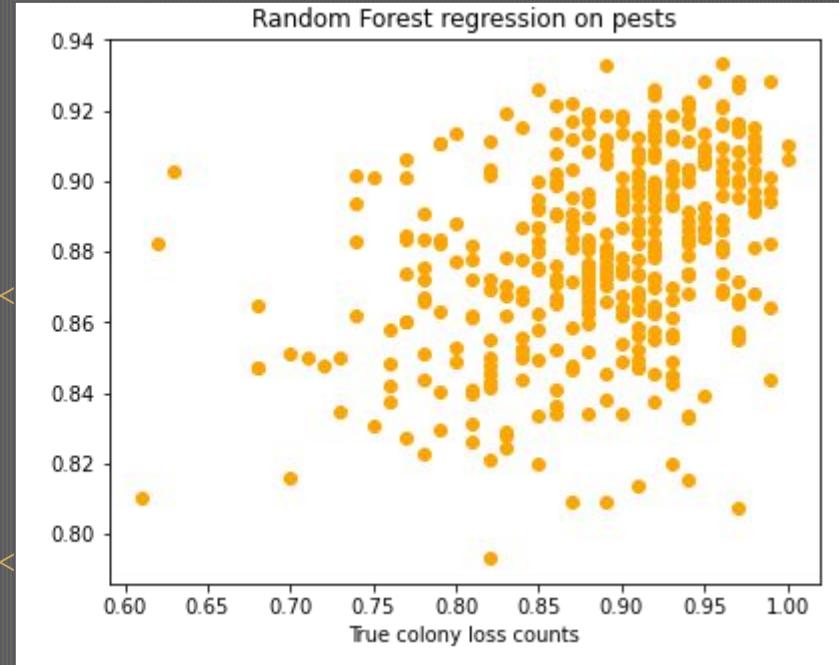
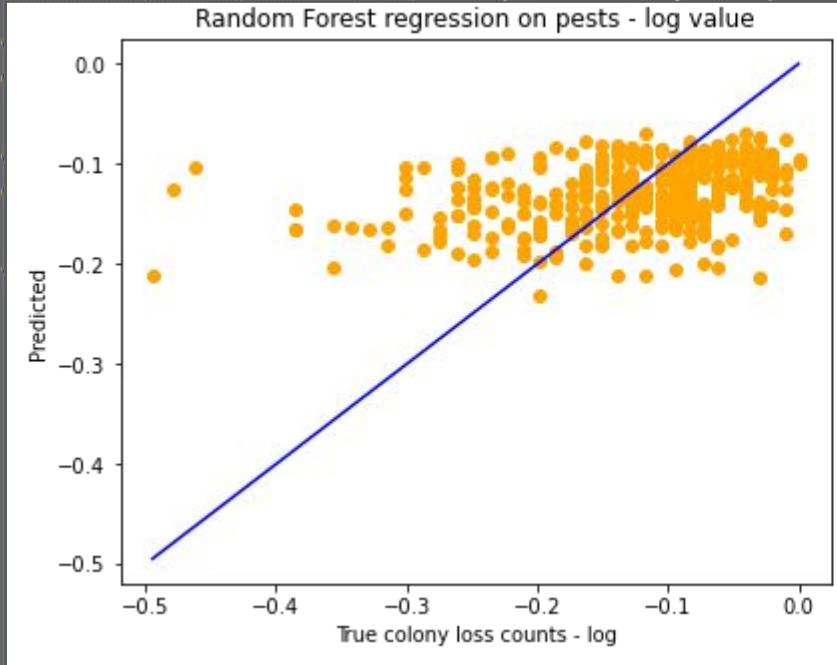
Seldom used but well  
suited here due to time  
constraints



ONE OF THE TOP PERFORMING MODELS:  
PREDICTIONS BASED ON ALL PEST DATA - LINEAR RIDGE



ONE OF THE TOP PERFORMING MODELS:  
PREDICTIONS BASED ON PATSY MATRIX - LINEAR RIDGE



ONE OF THE TOP PERFORMING MODELS:  
PREDICTIONS BASED ON PESTS - RANDOM FOREST

# BY THE NUMBERS

## THE BEST MODEL

0.047

Mean absolute  
error

0.077

RMSE

0.132

R-squared

Random  
forest - all  
pest data

# ABOUT ME



I've been a beekeeper since spring of 2019 and hosting hives since 2017.

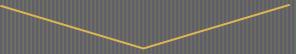
Springboard Data Science student  
Oct 2021 - Apr 2022

[www.github.com/squareleaf](https://www.github.com/squareleaf)

[www.linkedin.com/in/tiffanydgreen/](https://www.linkedin.com/in/tiffanydgreen/)



# THANKS



Many thanks to my mentor, Julian Jenkins III, and his endless patience

USDA bee data obtained thru:

[www.nass.usda.gov](http://www.nass.usda.gov)

<https://usda.library.cornell.edu/concern/publications/rn301137d?locale=en>

<https://www.kaggle.com/elljes15/bee-colony-data-cleaning-usda-data>

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