

# Iowa Liquor Project

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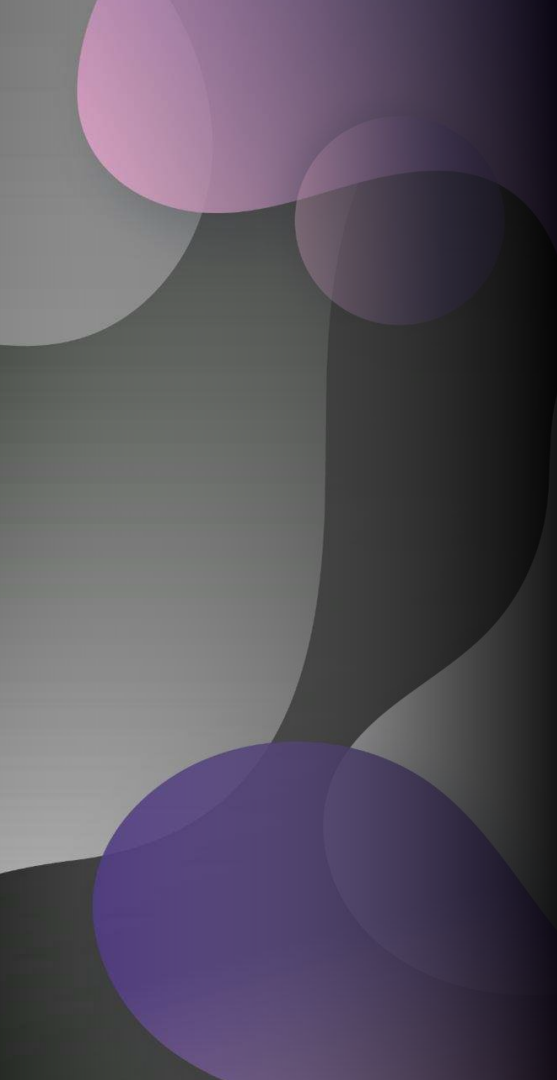
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# 01 | Business Understanding

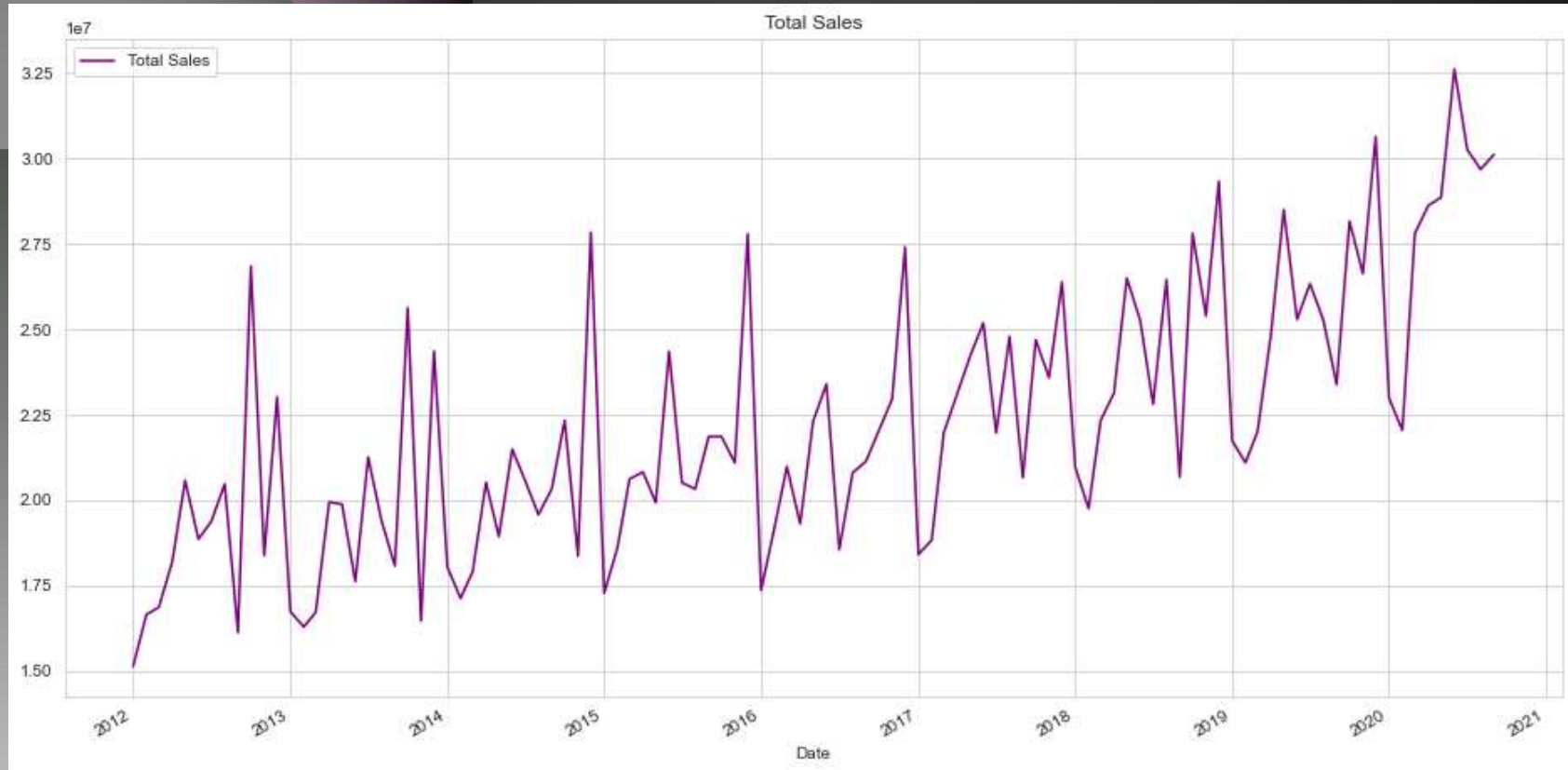
# About Cheers Alcohol



## Product Lines

- Wines 
- Beers 
- Ciders 
- Spirits & Liqueur 

# Iowa Liquor Market Trend



# STRATEGIC OBJECTIVES



If Cheers Alcohol wants to launch 3 stores, which county/counties should we target?



Predict the total sales for the counties we selected to launch stores in each month of 2021.



What items would we sell in each store? Select **top 10 items** in each store to promote.

# 02

## Data Processing

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# Main processing



## Features selection

Drop features

Target feature



## Cleaning

Missing data

Duplicated data

Outliers



## Transformation

Reduce data size

Subsets for modeling



# Feature Selection

## Drop Features

- Invoice/Item Number
- Store Name
- Address, Zip Code, Store Location
- Item Description
- Vendor Name
- Volume Sold(Gallons)

## Target Feature

- Sales (Dollars)

# Transformation

## Date

- Object → datetime type
- Change the datetime format “%Y-%m”
- Set date as index

## Reduce data memory size

- Int64 → int32/int8
- Float64 → float32
- Remove capitalization

**3.5+G → 1.5+G**

# Cleaning Data

## Missing Value

- Address
- City
- Zip Code
- Store Location
- County Number/ County
- Category/ Category Name
- Vendor Number/ Name
- State Bottle Cost
- State Bottle Retail
- Sale(Dollars)

## Duplicated Data

- No duplicate data

# Cleaning Data

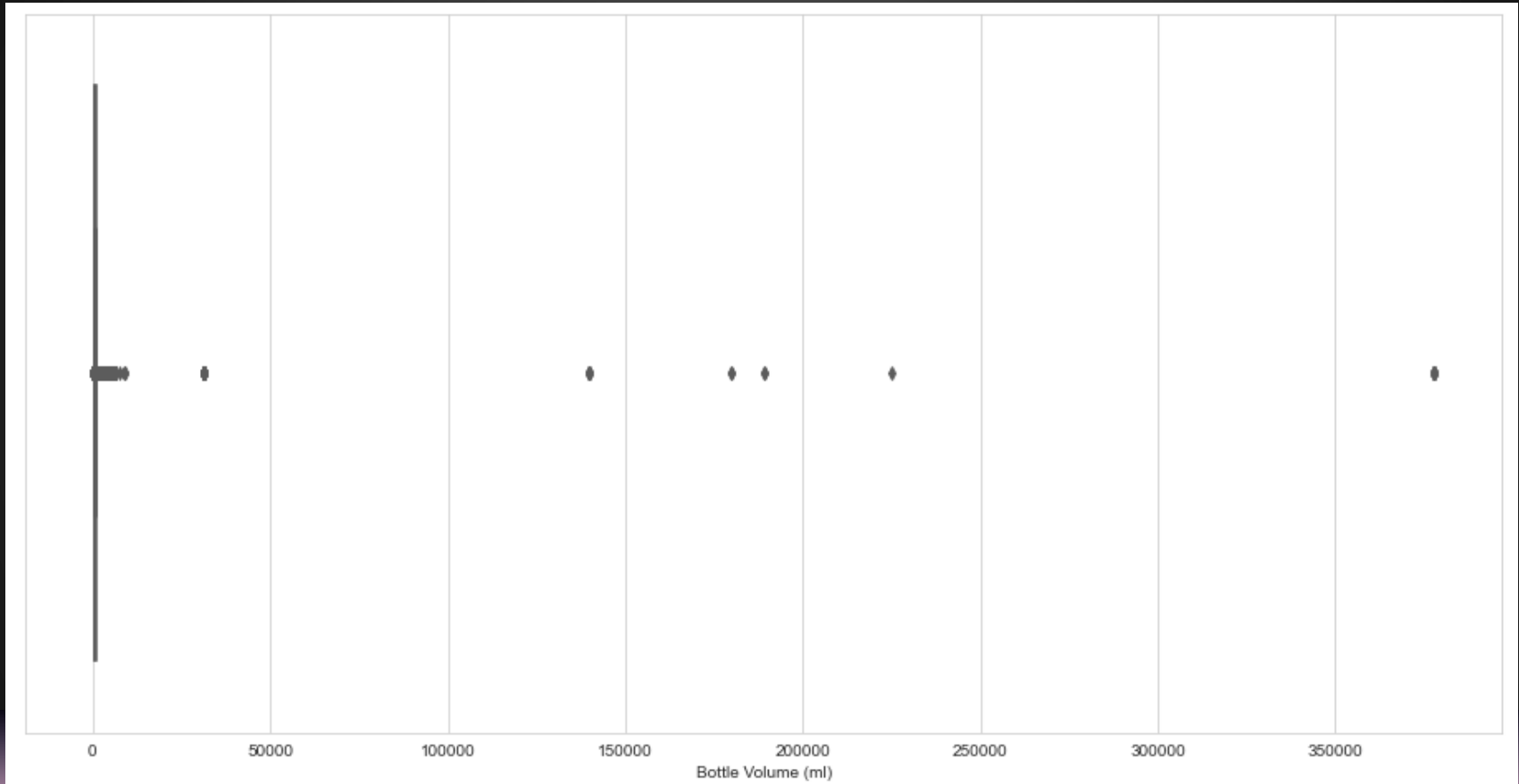
## Outliers

- Bottle Volume(ml)
- State Bottle Cost
- State Bottle Retail
- Bottles Sold
- Sales (Dollars)
- Volume Sold (Liters)

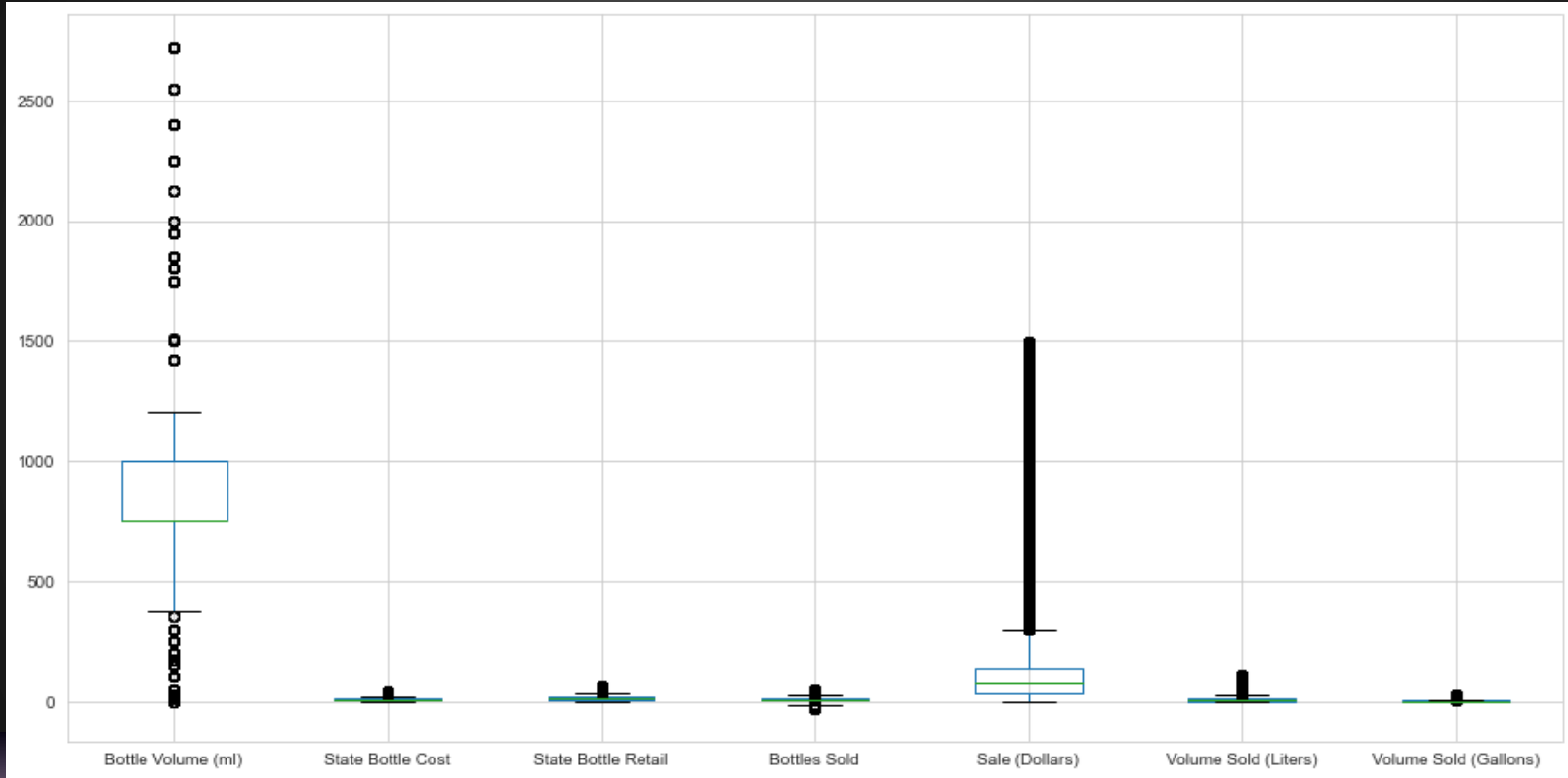
## Treatment

- Replace outlier with 3 std

## Boxplot of bottle volume(ml) with outliers



## Boxplot of numeric column **after** replacing outliers



# How to choose the new store locations?



**Which counties sold the most alcohol?**

Total Sales of county



**Are these counties already overstocked?**

Number of stores in the county

# Which counties sold most liquor?

01



Sum up the total sales of each store

02



Take average of store level sales by each county

03



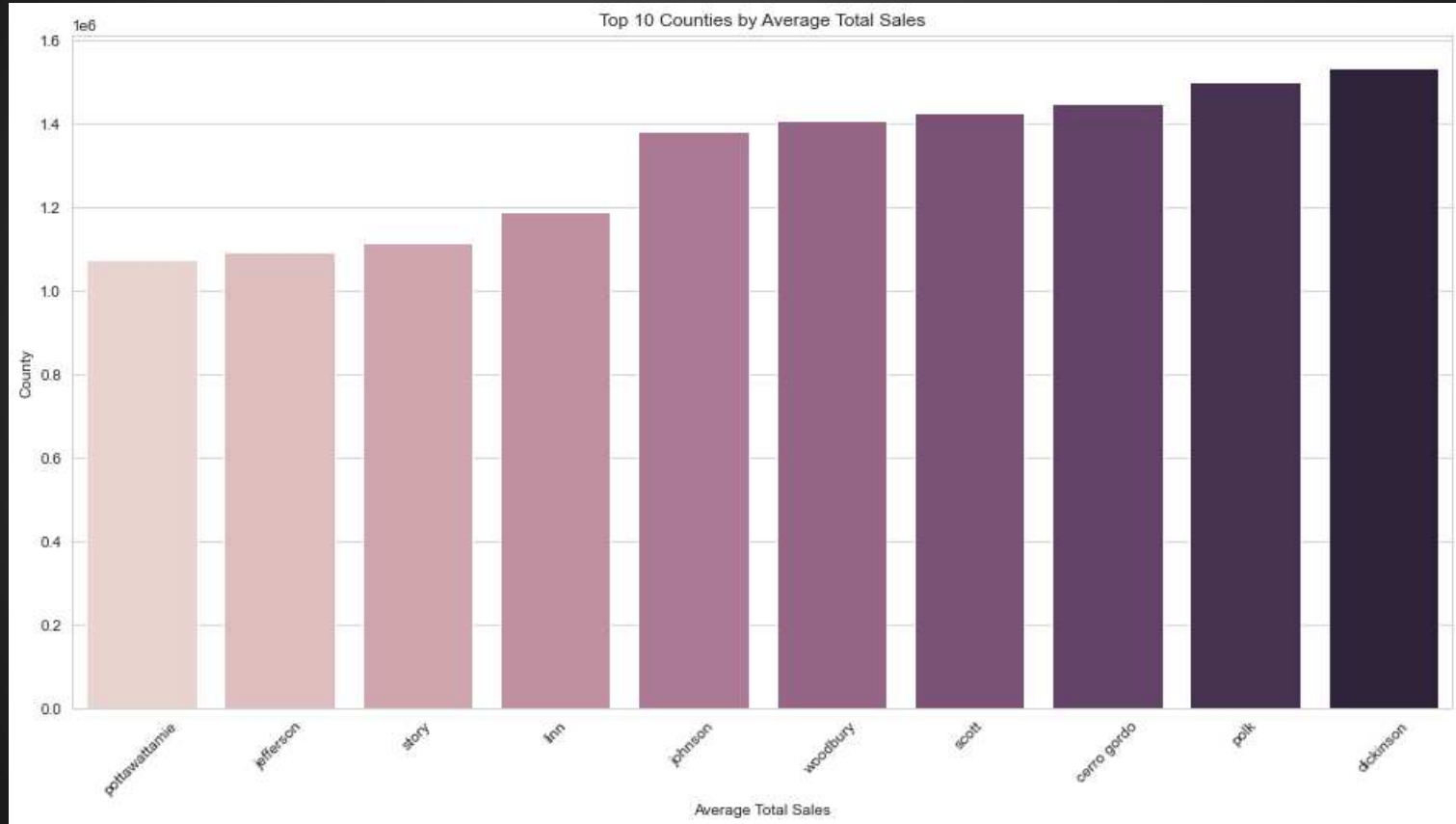
Rank the top 10 counties

## Top 10 counties by average total sales

1	Dickinson	6	johnson
2	Polk	7	linn
3	cerro gordo	8	story
4	scott	9	jefferson
5	woodbury	10	pottawattamie



# Top 10 Sales Counties



# Word cloud for Top 10 Counties by Sales



# Do these counties already have too much store?

01



Select the distinct  
Store Number in each  
county

02



Count the Stores in  
each county

03

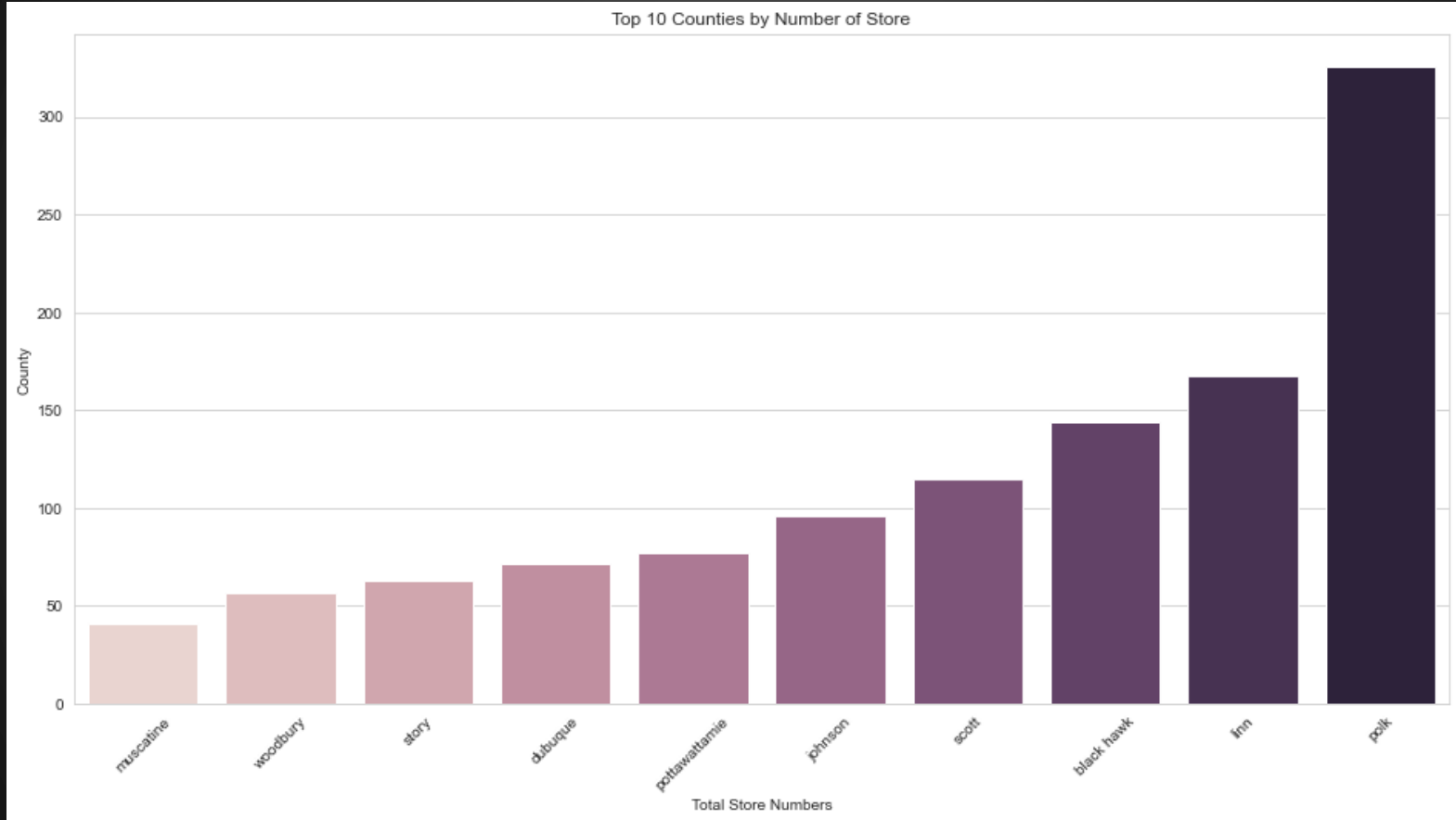


Rank the top 10  
counties with most  
stores

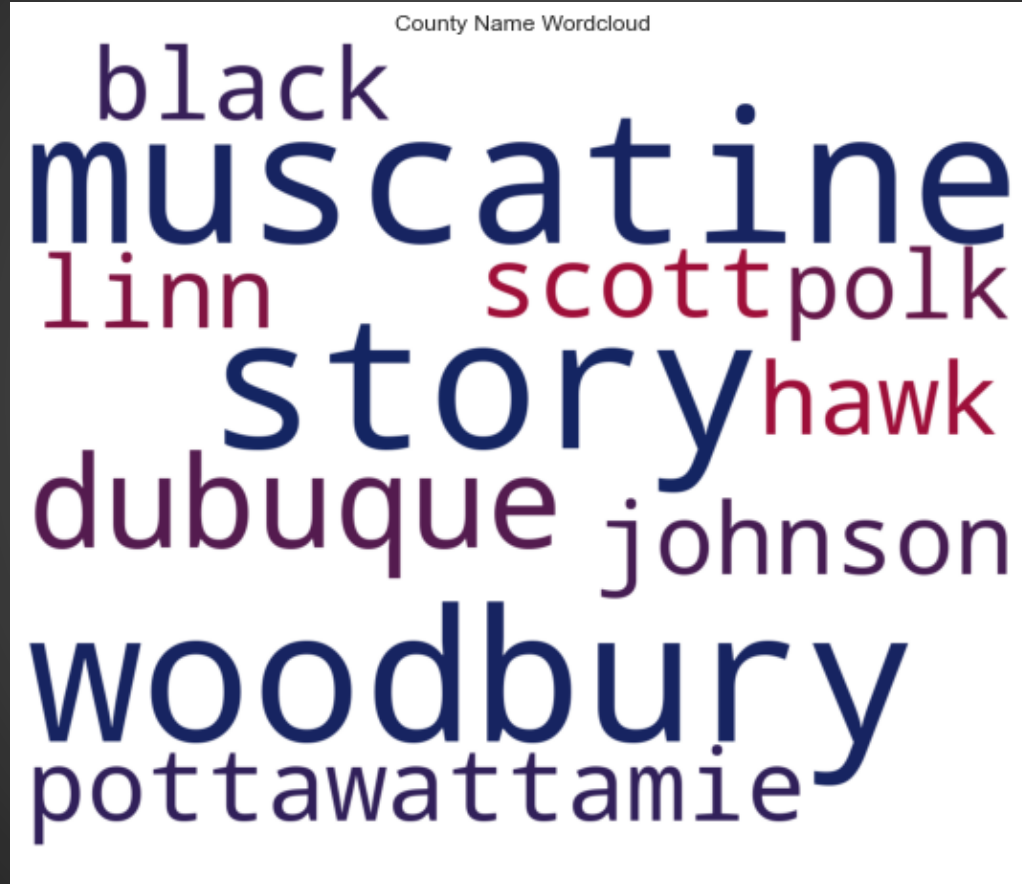
## Top 10 counties by number of stores

1	Polk	6	pottawattamie
2	Linn	7	dubuque
3	Black hawk	8	Story
4	Scott	9	woodbury
5	Johnson	10	muscatine

# Top 10 Counties by Store Numbers



# Word cloud for Top 10 Counties by Sales

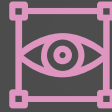


# We choose these counties...

In Top 10 counties by average total sales  
**NOT** in Top 10 counties by number of stores



Dickinson



Jefferson



Cerro Gordo

# 10 items we choose to sell in Dickinson

01



Select the county we will to locate

02



Sum up the sales by item number

03



Rank the top 10 items

## Top 10 items by total sales in Dickinson

1	Captain Morgan Spiced Rum	6	Titos Handmade Vodka
2	Black Velvet	7	Barton Vodka
3	Crown Royal Canadian Whisky	8	Grey Goose Vodka
4	Jack Daniels Old #7 Black Lbl	9	Malibu Coconut Rum
5	Fireball Cinnamon Whiskey	10	Titos Handmade Vodka

# 10 items we choose to sell in Jefferson/Cerro Gordo

## Top 10 items by total sales in Jefferson

1	Black Velvet	6	Captain Morgan Original Spiced
2	Hawkeye Vodka	7	Crown Royal
3	Jack Daniels Old #7 Black Lbl	8	Captain Morgan Spiced Rum
4	Templeton Rye	9	Fireball Cinnamon Whiskey
5	Titos Vodka	10	Jameson

## Top 10 items by total sales in Cerro Gordo

1	Black Velvet	6	Jack Daniels Old #7 Black Lbl
2	Captain Morgan Spiced Rum	7	Captain Morgan Spiced Barrel
3	Hawkeye Vodka	8	Absolut Swedish Vodka 80 Prf
4	Fireball Cinnamon Whiskey Mini Dispenser	9	Titos Handmade Vodka
5	Crown Royal Canadian Whisky	10	Black Velvet





# 03 | Modelling

Training data: 0.75

Test data: 0.25

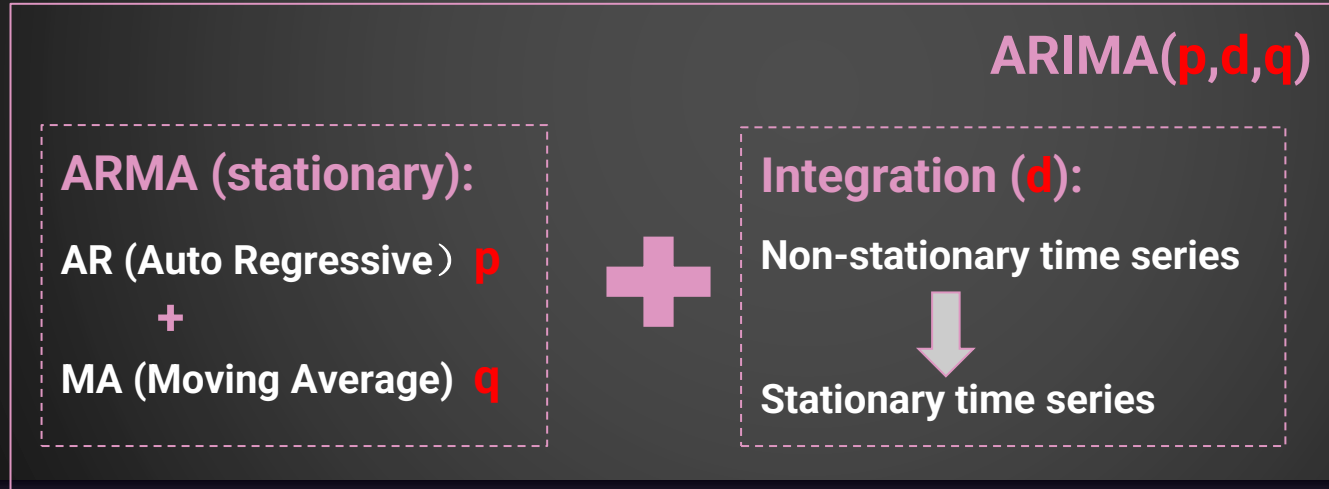
**ARIMA**

**SARIMAX**

**Facebook Prophet**

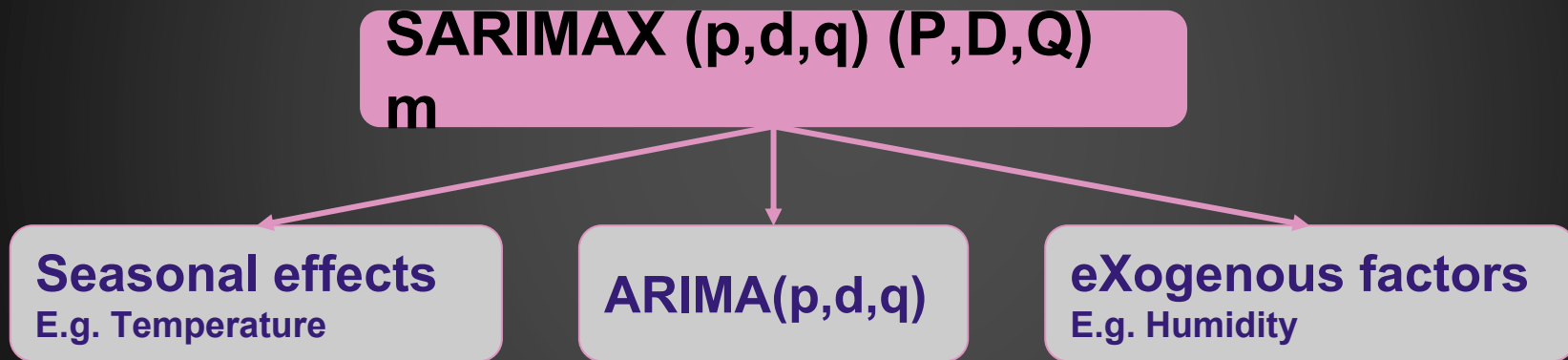
# ARIMA (Autoregressive integrated moving average)

- A common time series forecasting model
- Predict the future values based on the past values
- An extension of simpler ARMA model (Autoregressive Moving Average)



# SARIMAX (Seasonal ARIMA with eXogenous factors)

- An updated version of the ARIMA model
- Include seasonal effects and eXogenous factors



# Facebook Prophet

- Forecasting time series data based on an additive regressive model
- Decomposes time series data into trend, seasonality and holiday effect

$$y(t) = g(t) + s(t) + h(t) + e(t)$$

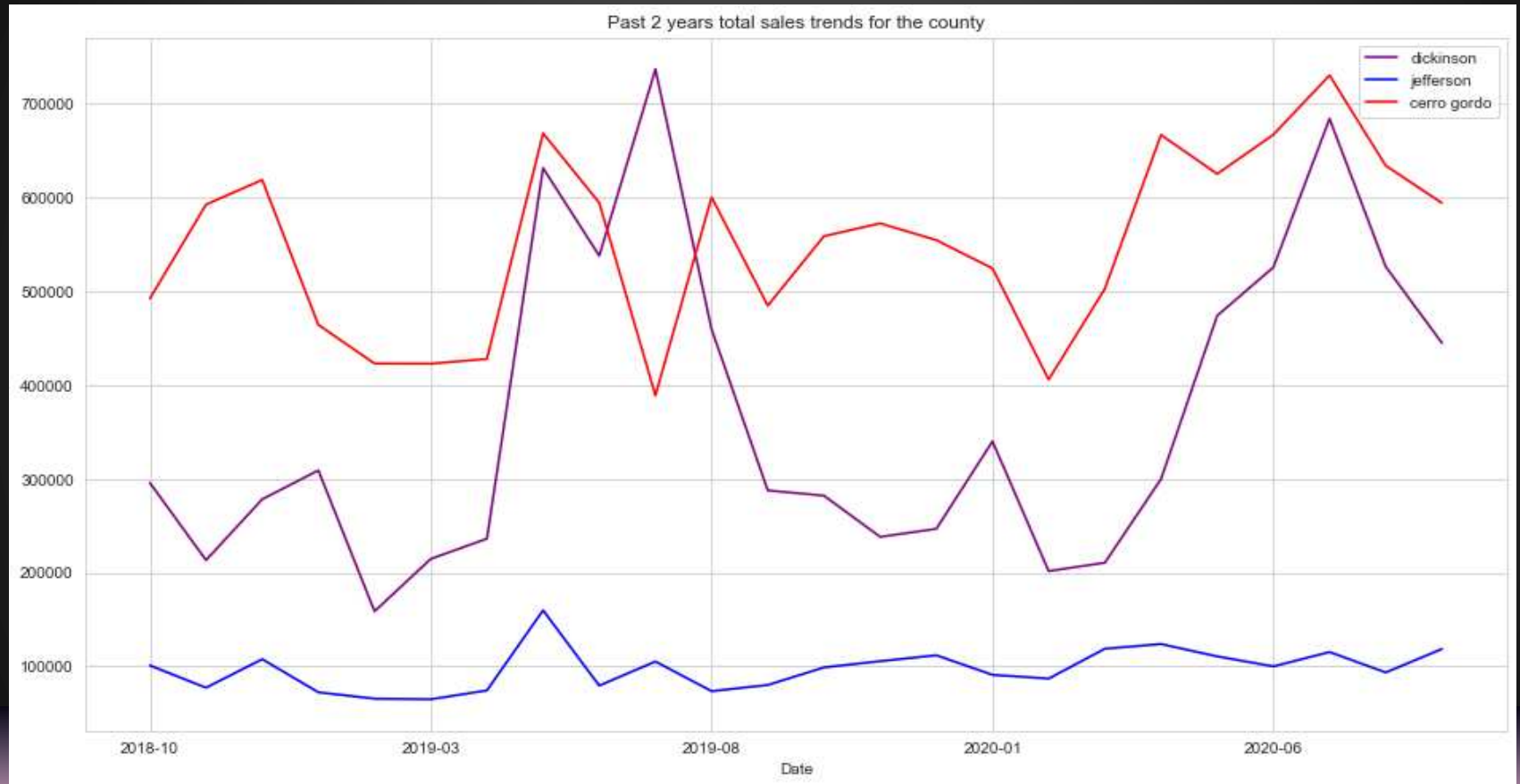
**g(t)**: a trend function which models the non-periodic changes

**s(t)**: a periodic changes i.e weekly, monthly, yearly.

**h(t)**: effects of holidays (user provided) with irregular schedules

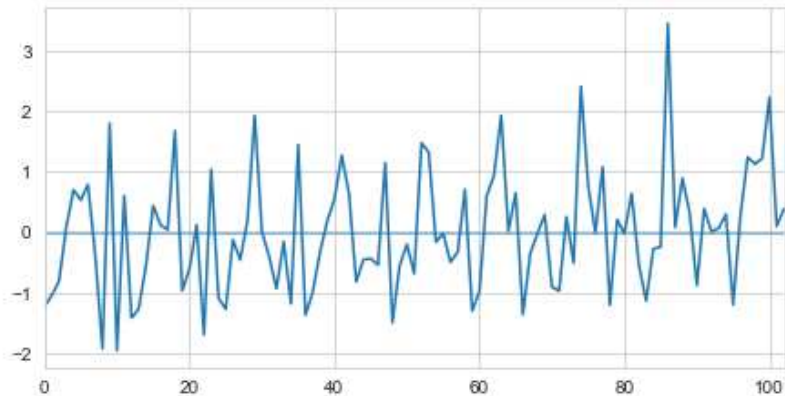
**e(t)**: error changes

# Three Counties Trend

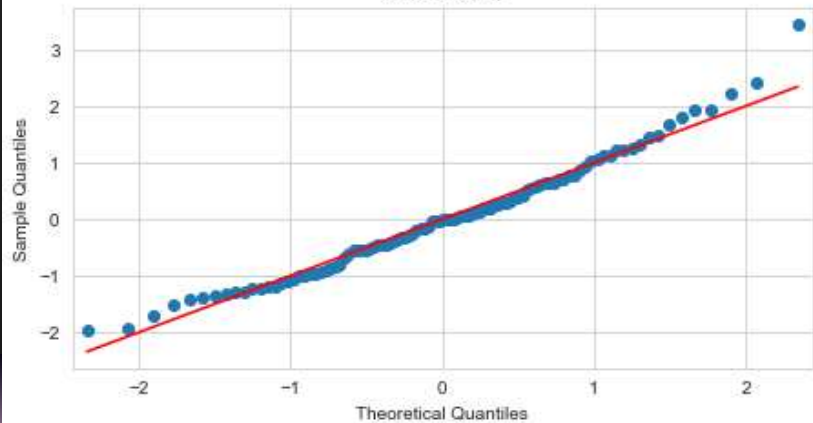


# ARIMA

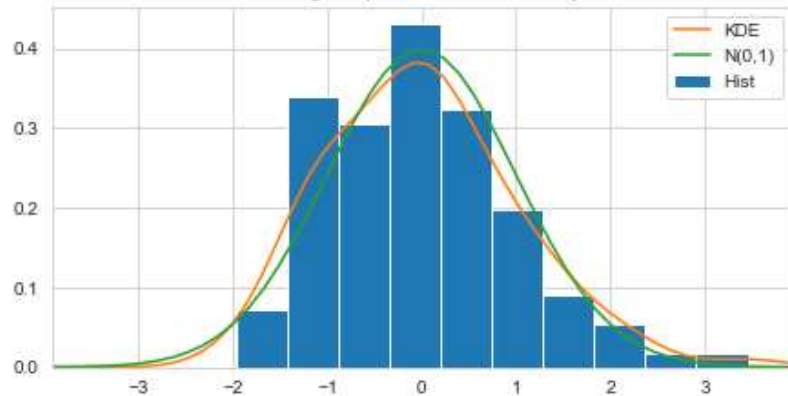
Standardized residual



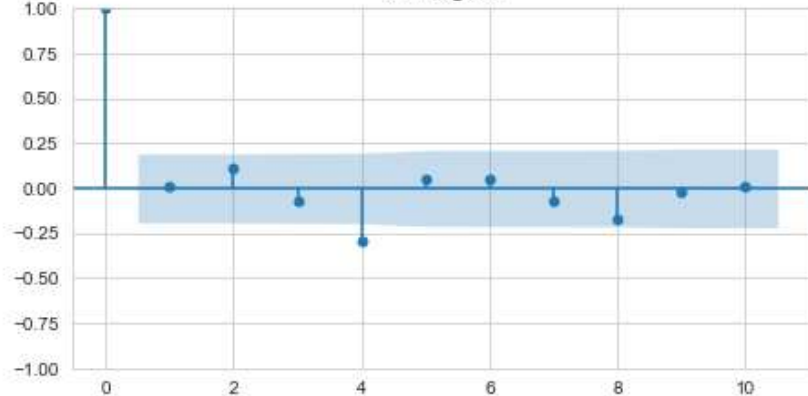
Normal Q-Q



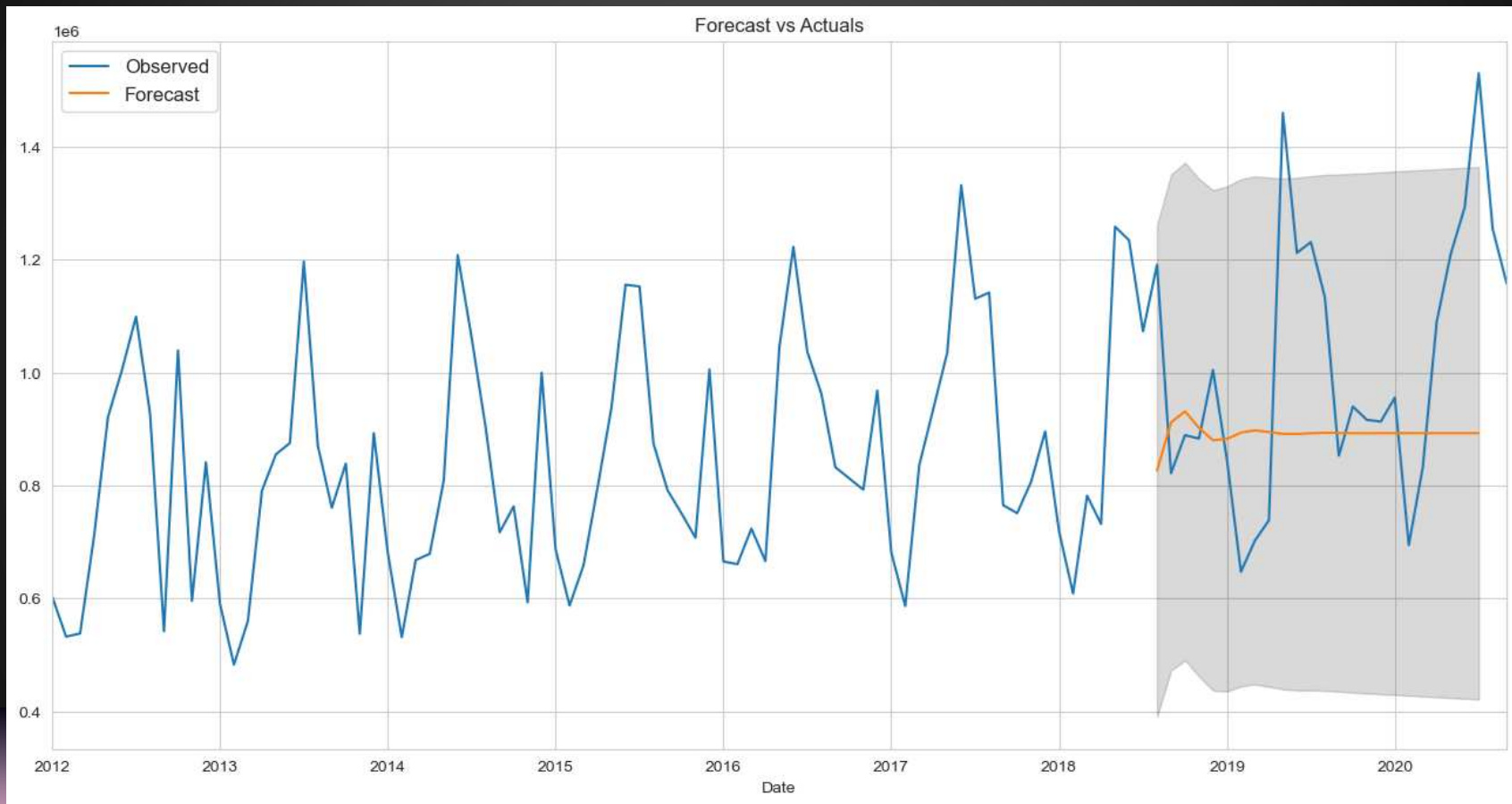
Histogram plus estimated density



Correlogram

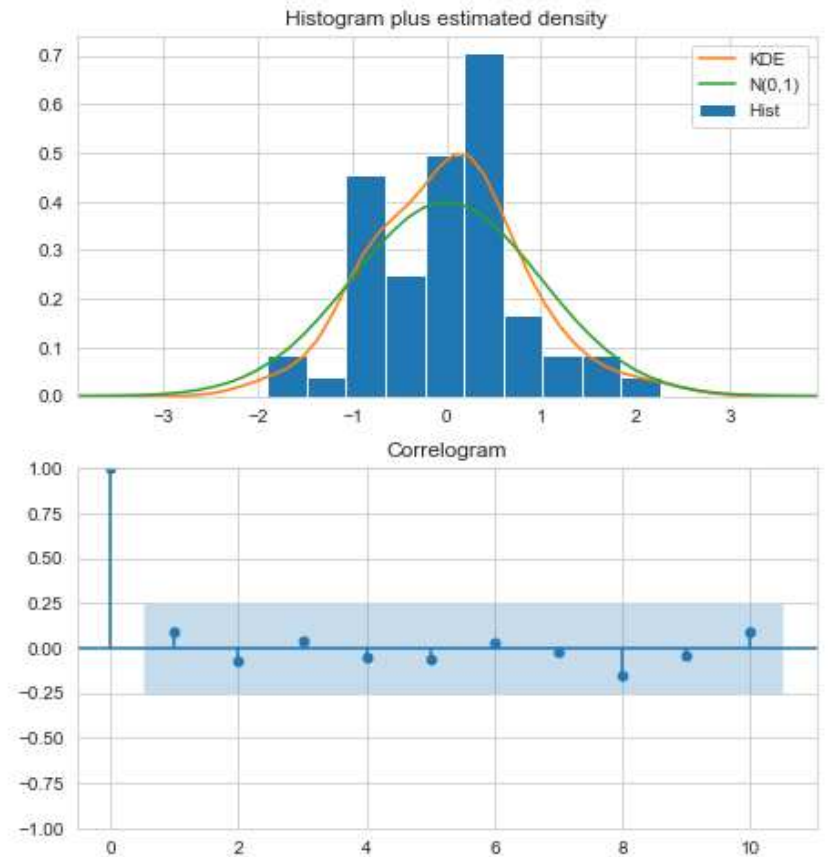
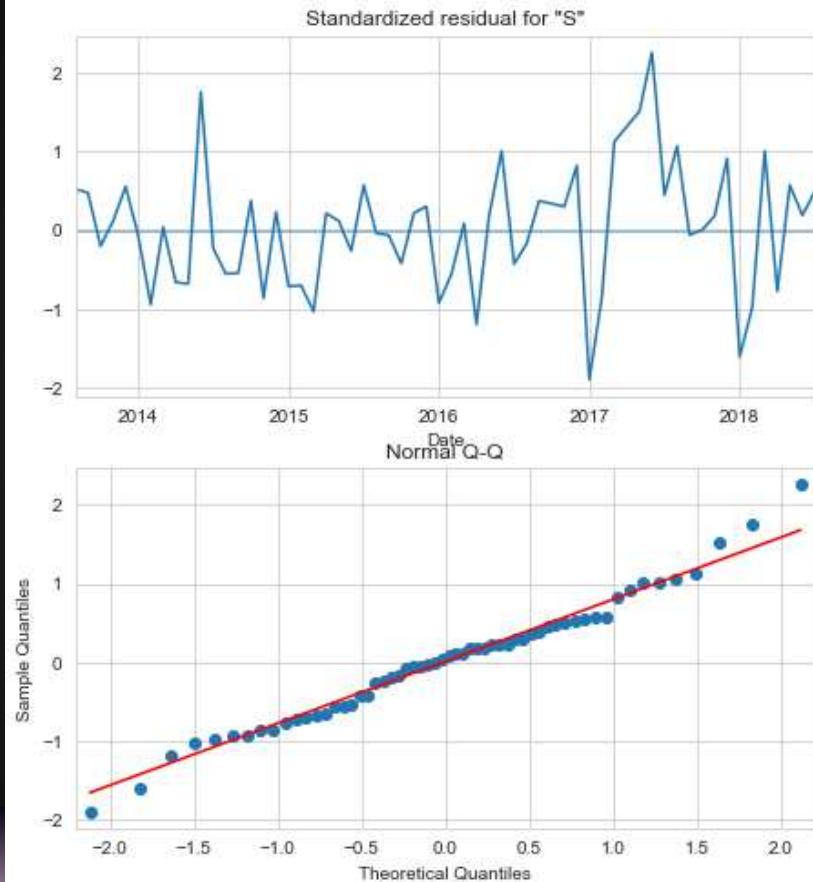


# ARIMA Actual vs Forecast

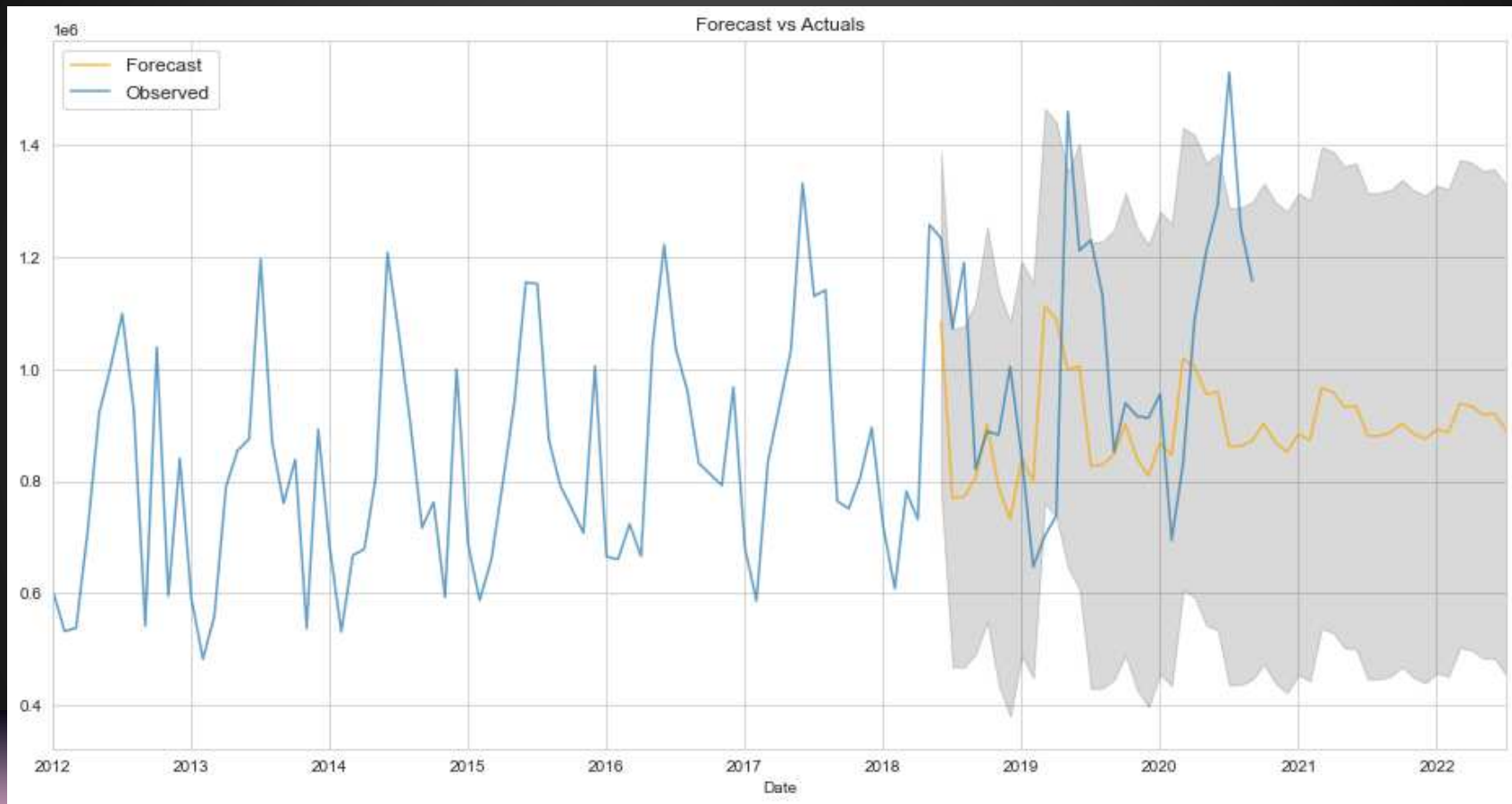




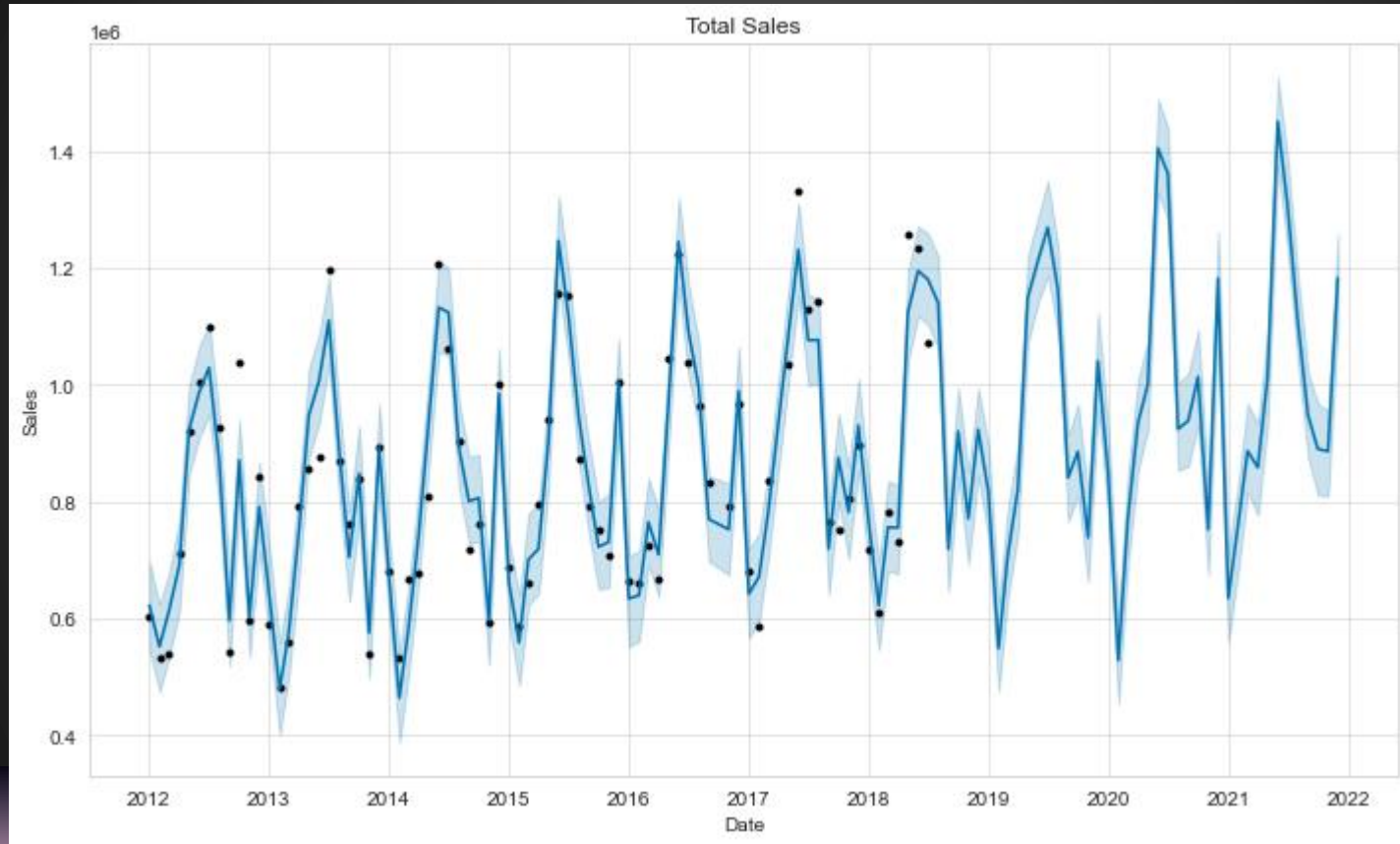
# SARIMAX



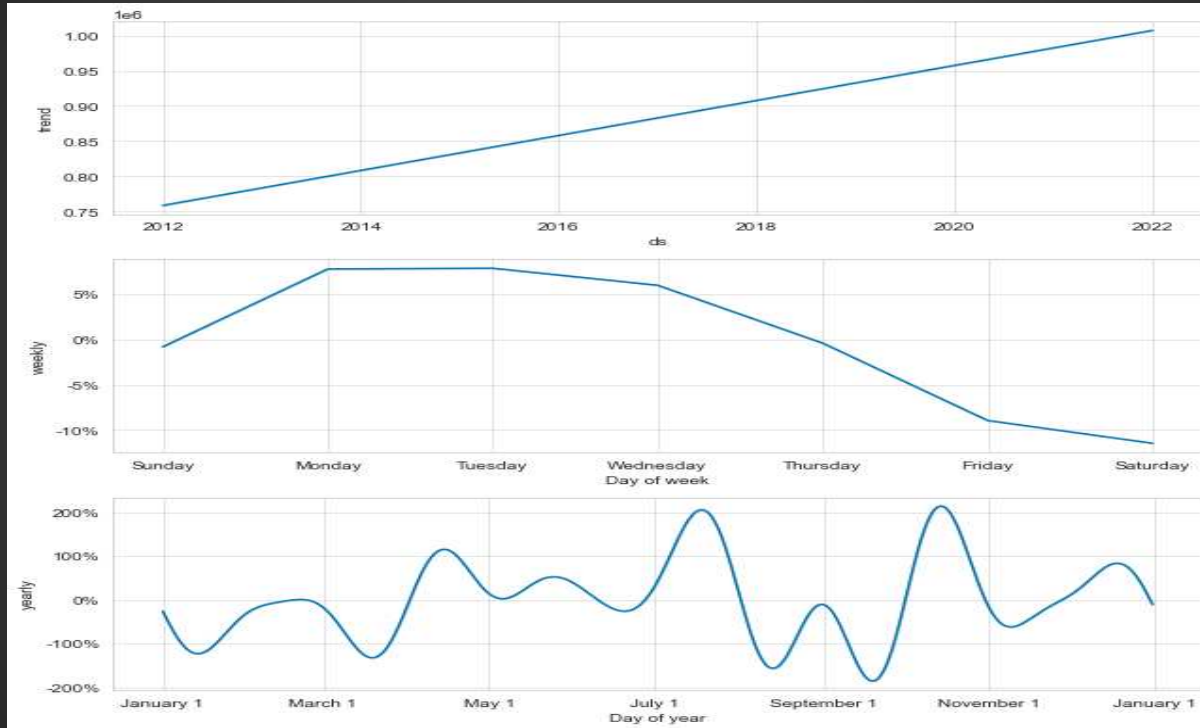
# SARIMAX Actual vs Forecast



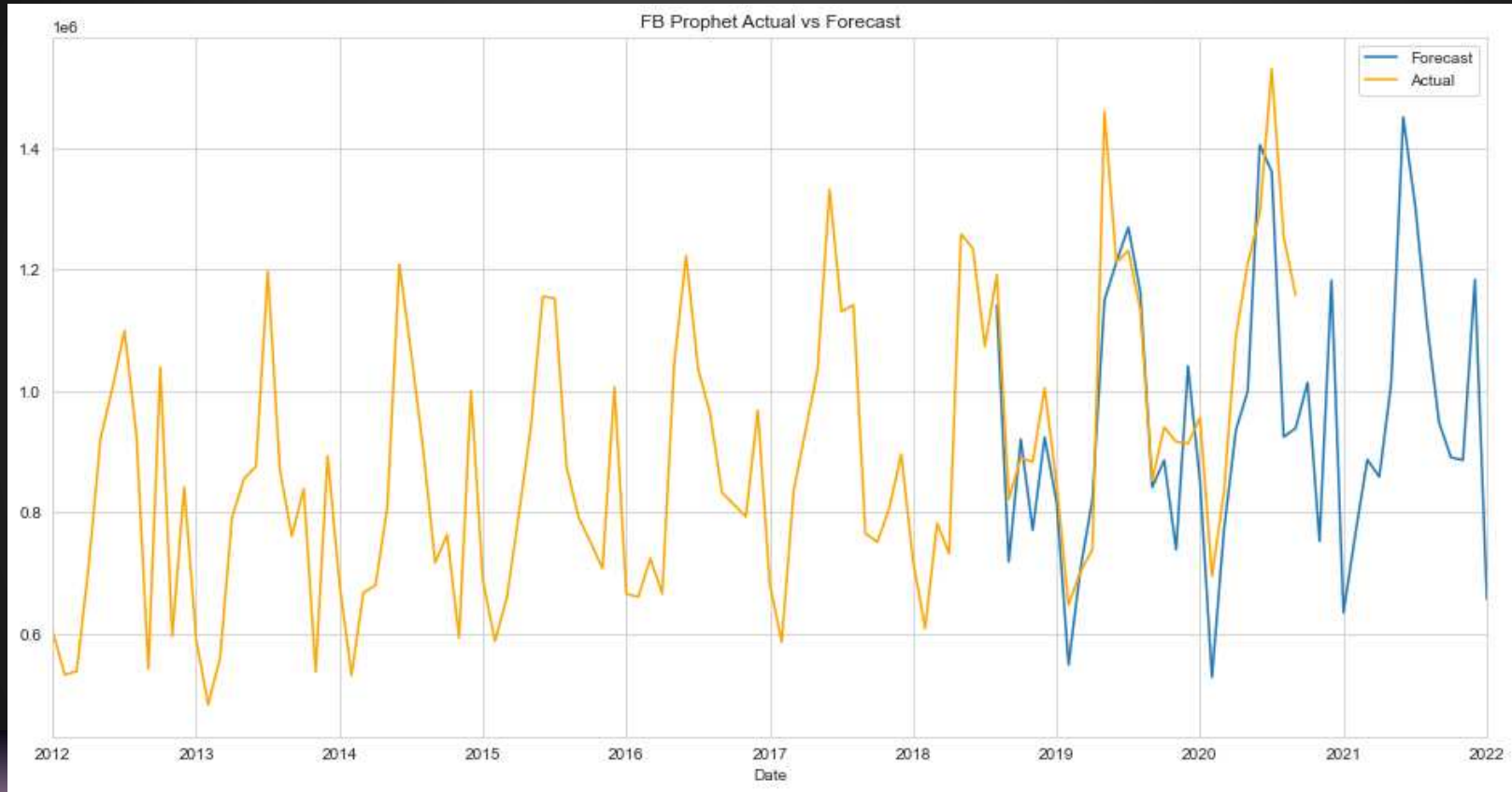
# FB Prophet Model



# FB Prophet Model



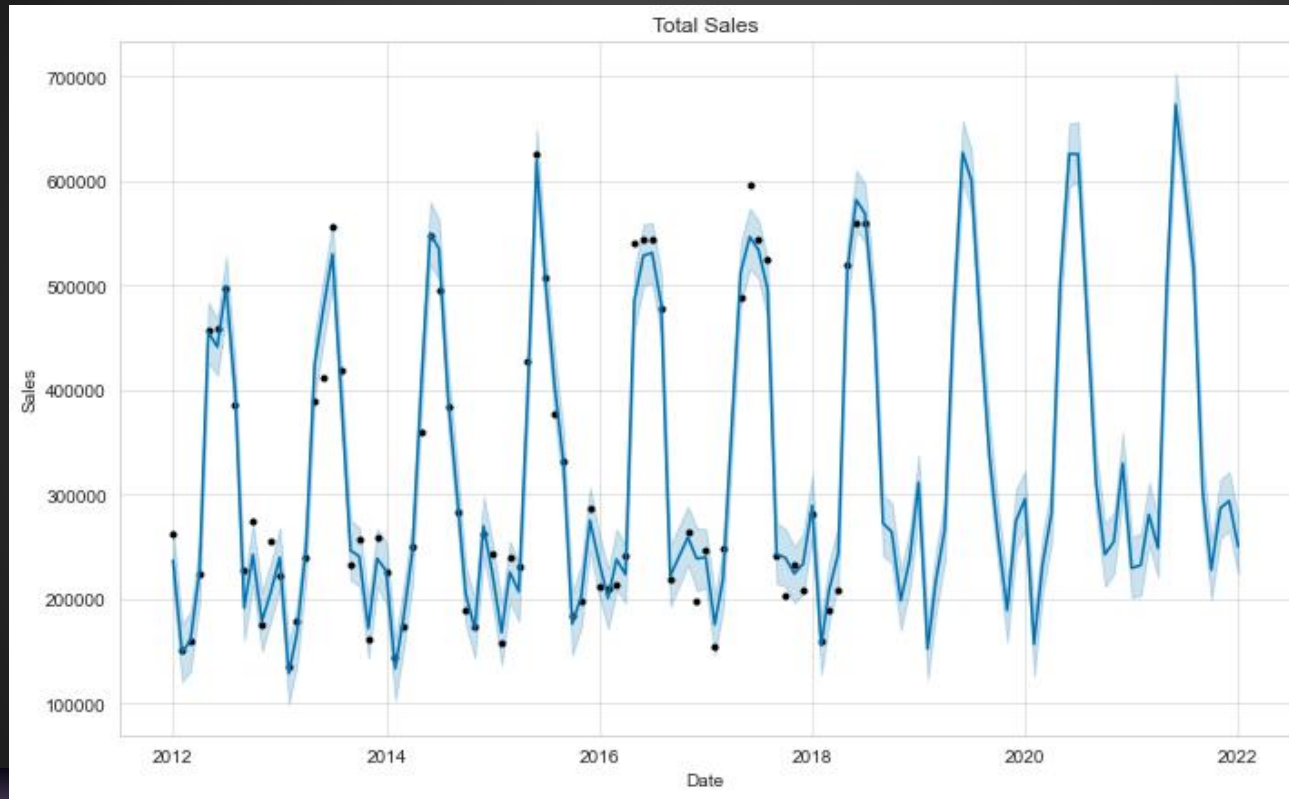
# FB Prophet Model



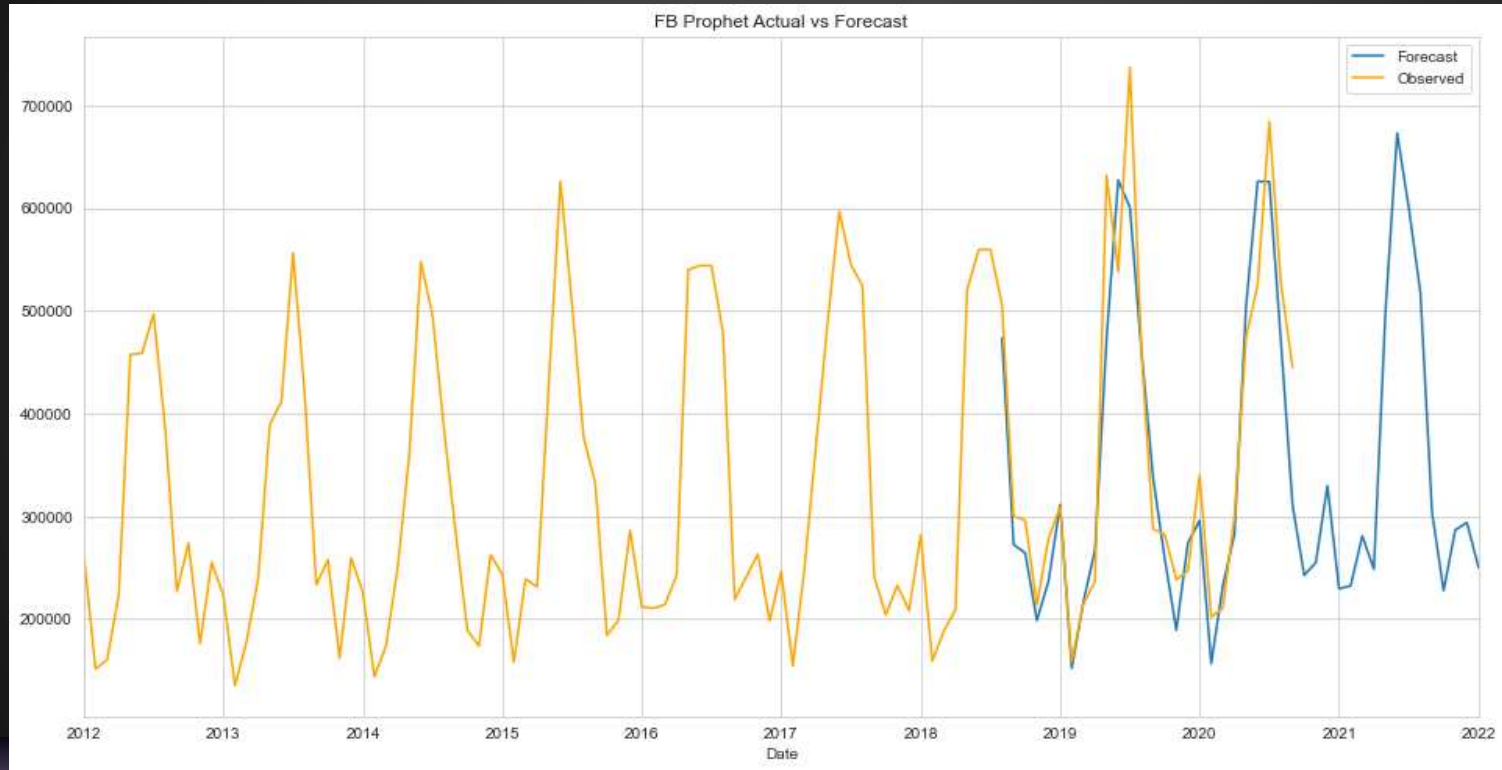
# Evaluation Metrics

Model	MSE	RMSE	MAE
ARIMA	54,434,385,279.0	233,311.78	202,573.79
SARIMAX	78,075,356,102.92	279,419.68	221,991.9
<b>FB Prophet</b>	<b>19,588,716,071.92</b>	<b>139,959.69</b>	<b>110,473.41</b>

# Dickinson

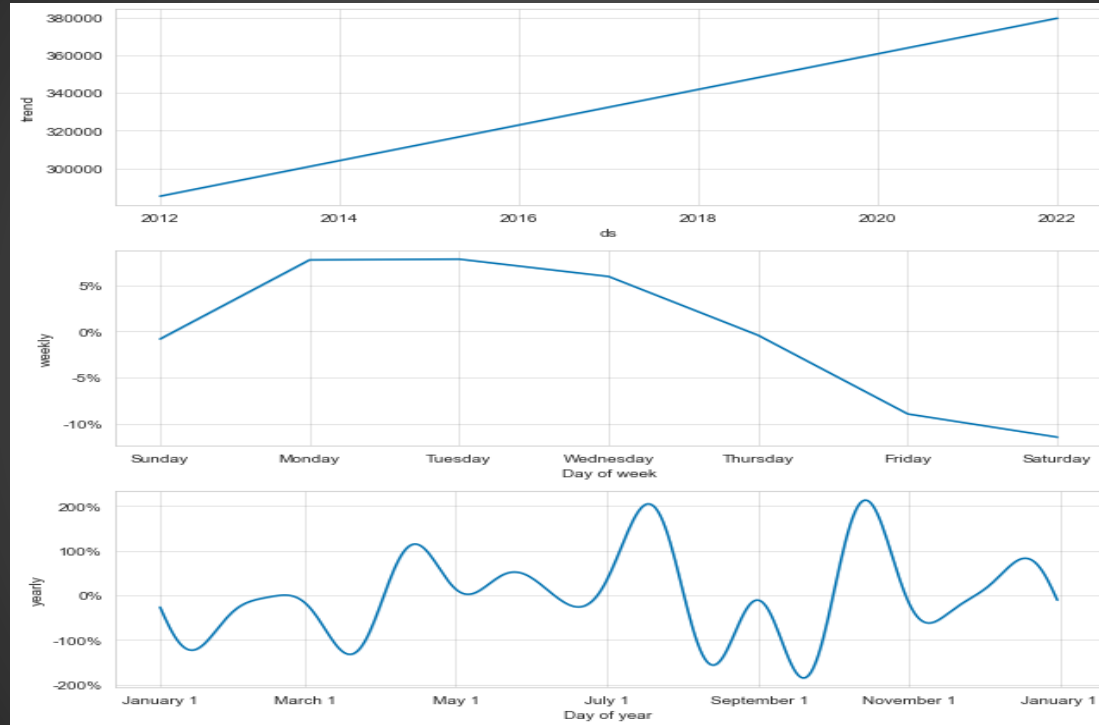


# Dickinson

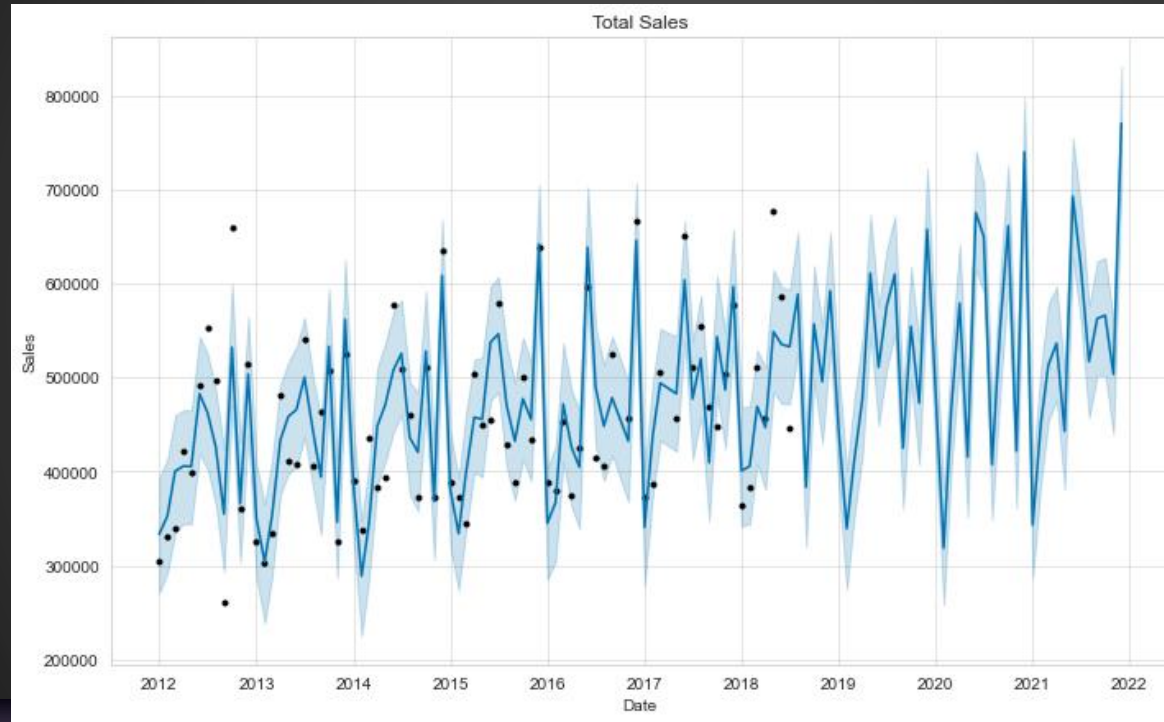




# Dickinson



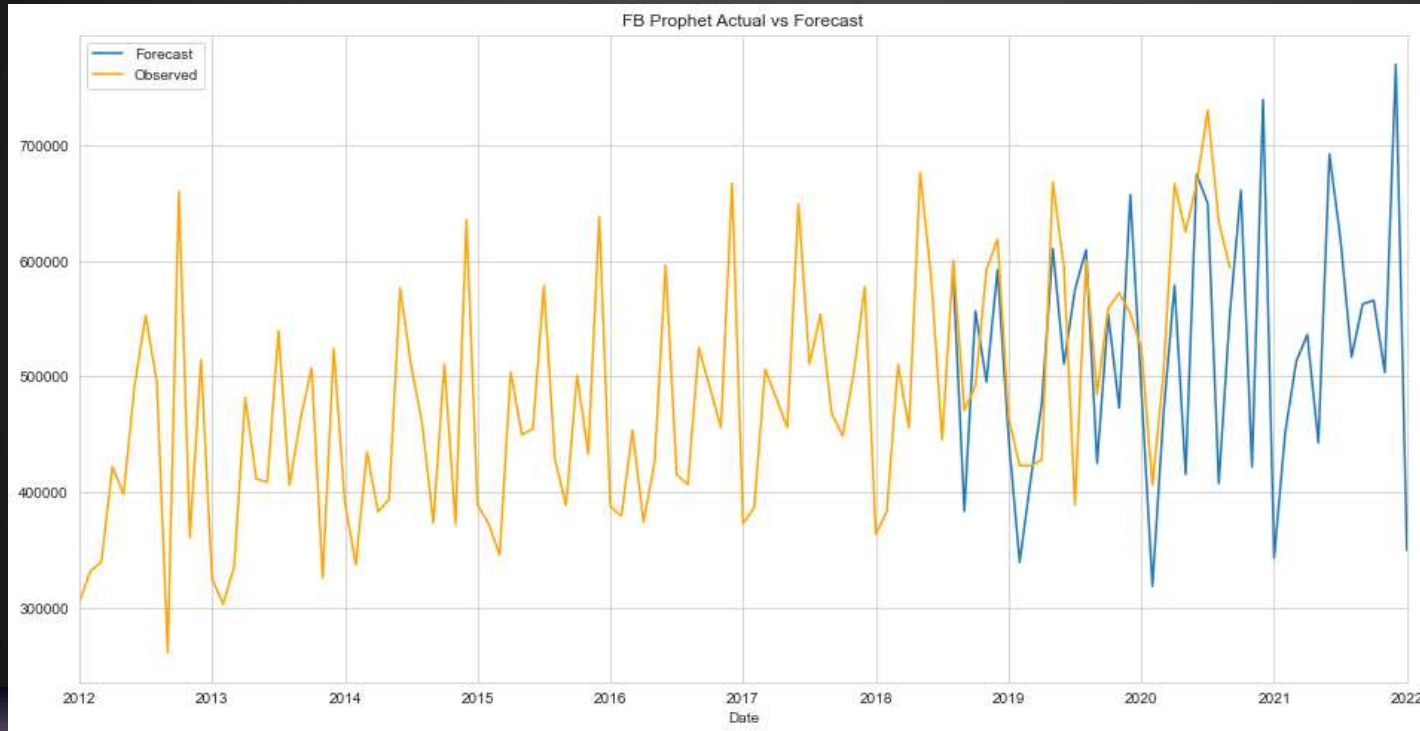
# Cerro Gordo



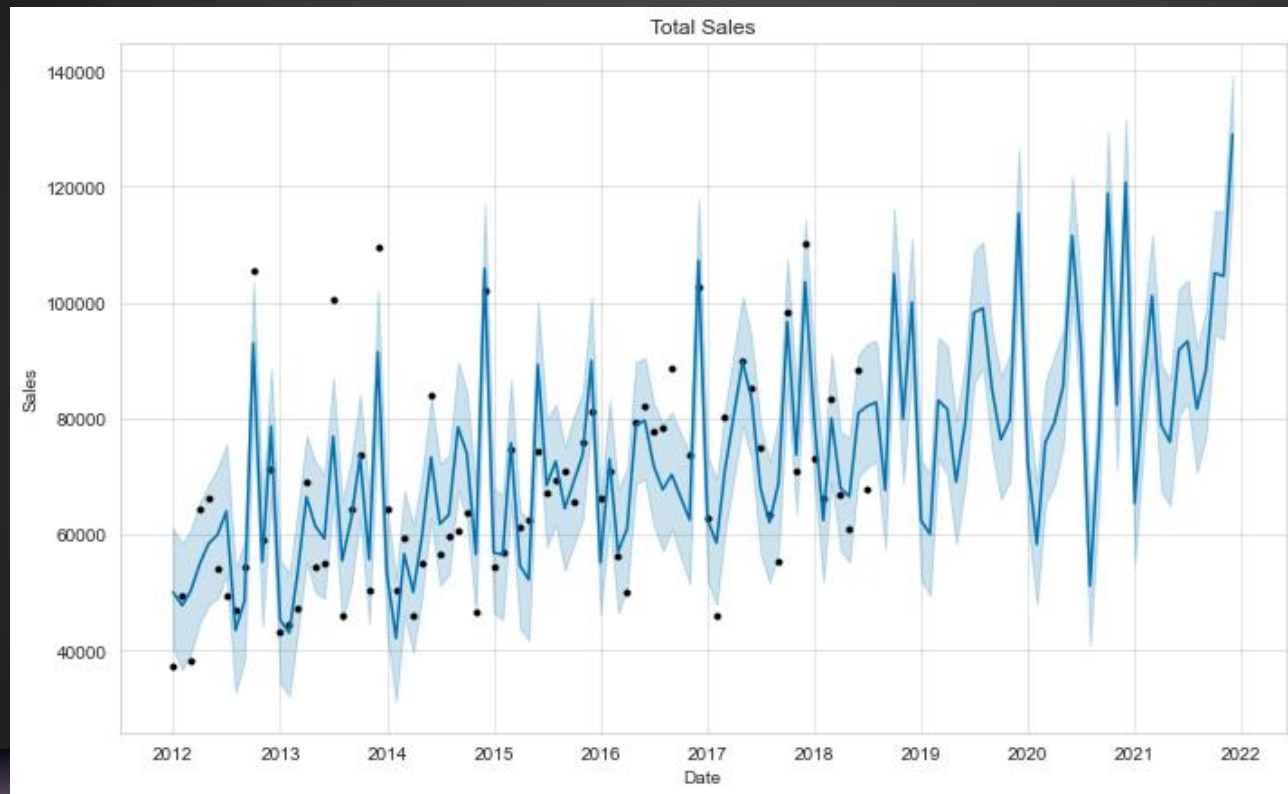
# Cerro Gordo



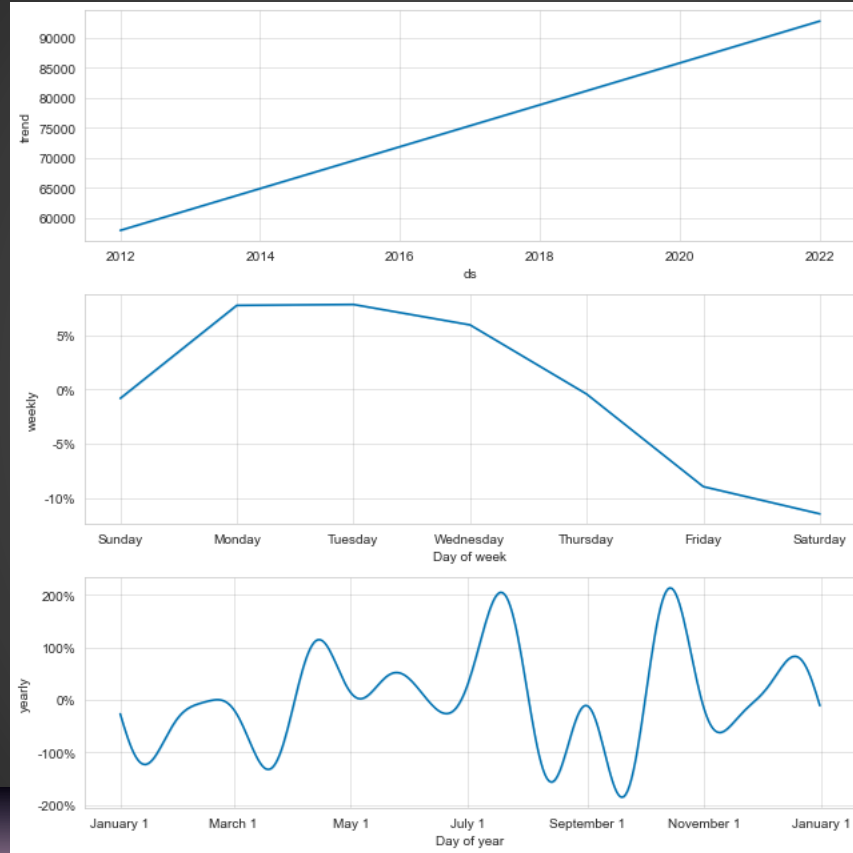
# Cerro Gordo



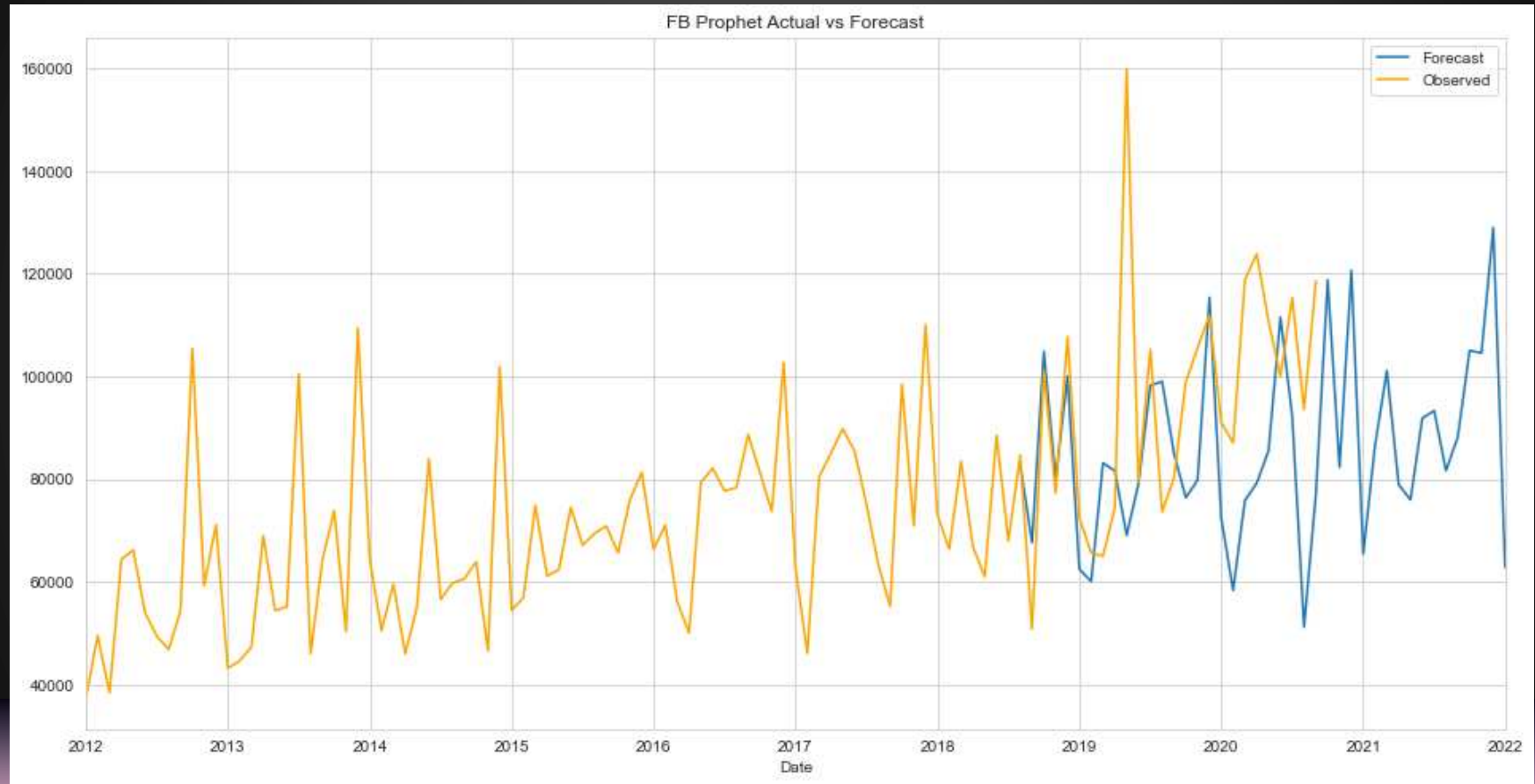
# Jefferson



# Jefferson



# Jefferson



# Evaluation Metrics

Model	MSE	RMSE	MAE
Dickinson	3,989,625,541.06	63,163.48	47,379.22
Cerro Gordo	8,562,582,540.07	92,534.22	71,722.83
Jefferson	802,734,699.72	28,332.57	20,488.71





04

# Conclusion

# Top 10 items we choose to sell in Dickinson

## 10 items will be sold in Dickinson

- |   |                               |    |                      |
|---|-------------------------------|----|----------------------|
| 1 | Captain Morgan Spiced Rum     | 6  | Titos Handmade Vodka |
| 2 | Black Velvet                  | 7  | Barton Vodka         |
| 3 | Crown Royal Canadian Whisky   | 8  | Grey Goose Vodka     |
| 4 | Jack Daniels Old #7 Black Lbl | 9  | Malibu Coconut Rum   |
| 5 | Fireball Cinnamon Whiskey     | 10 | Titos Handmade Vodka |

# Top 10 items we choose to sell in Jefferson/Cerro Gordo

## 10 items will be sold in Jefferson

1	Black Velvet	6	Captain Morgan Original Spiced
2	Hawkeye Vodka	7	Crown Royal
3	Jack Daniels Old #7 Black Lbl	8	Captain Morgan Spiced Rum
4	Templeton Rye	9	Fireball Cinnamon Whiskey
5	Titos Vodka	10	Jameson

## 10 items will be sold in Cerro Gordo

1	Black Velvet	6	Jack Daniels Old #7 Black Lbl
2	Captain Morgan Spiced Rum	7	Captain Morgan Spiced Barrel
3	Hawkeye Vodka	8	Absolut Swedish Vodka 80 Prf
4	Fireball Cinnamon Whiskey Mini Dispenser	9	Titos Handmade Vodka
5	Crown Royal Canadian Whisky	10	Black Velvet

# Predict Sales

Location	2021 Jan.	2021 Feb.	2021 Mar.	2021 Apr.	2021 May.	2021 Jun.	2021 Jul.	2021 Aug.	2021 Sept.	2021 Oct.	2021 Nov.	2021 Dec.	2022 Jan.
Dickson	229,330	232,196	280,656	248,496	500,644	672,958	600,381	517,784	303,800	227,561	286,686	293,768	250,196
Jefferson	65,411	86,550	101,158	78,909	75,974	91,866	93,331	81,648	88,240	105,080	104,568	129,019	62,824
Cerogordo	343,148	451,502	513,170	536,423	442,848	692,574	618,812	516,957	562,724	566,045	503,472	770,057	349,752

# Business Recommendations

## Go-in market strategies

01



Go to the market with less competition.

02



Direct acquisition of existing beer stores.

03



Conducting Online Sales.

## Product Selling strategies

04



Bundling sale

05



Selected main products.

06



Giveaway promotion.

# THANKS!

Do you have any  
questions?

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# Appendix

## Data Quality Report

# Overview of data

The 'Iowa liquor sales' data set collects the invoices from 2012/01/03 to 2020/09/30.

Columns includes transactions information, store level info, item level info.

## Columns

1	Invoice/Item Number	6	City	11	Category	16	Item Description	21	Bottles Sold
2	Date	7	Zip Code	12	Category Name	17	Pack	22	Sale (Dollars)
3	Store Number	8	Store Location	13	Vendor Number	18	Bottle Volume (ml)	23	Volume Sold (Liters)
4	Store Name	9	County Number	14	Vendor Name	19	State Bottle Cost	24	Volume Sold (Gallons)
5	Address	10	County	15	Item Number	20	State Bottle Retail		



# Statistic summary of numerical columns

	Pack	Bottle Volume (ml)	State Bottle Cost	State Bottle Retail	Bottles Sold	Sale (Dollars)	Volume Sold (Liters)
mean	12.3	911.7	9.6	14.7	8.8	128.2	8.9
std	7.6	604.2	9.8	14.8	12.8	456.1	33.0
min	-96.0	0.0	0.0	0.0	-128.0	0.0	0.0
25%	6.0	750.0	5.5	8.3	2.0	31.5	1.5
50%	12.0	750.0	8.2	12.3	6.0	71.5	5.0
75%	12.0	1000.0	12.1	18.1	12.0	139.3	10.5
max	120.0	378000.0	6468.0	9702.0	127.0	279557.3	15000.0

# Completeness of data

Most columns has no missing value, except **store location**.

Columns name	Number of Missing Value	% of missing value
Invoice/Item Number	0	0%
Date	0	0%
Store Number	0	0%
Store Name	0	0%
Address	79927	0%
City	79926	0%
Zip Code	79971	0%
Store Location	1886023	10%

# Completeness of data

Columns name	Number of Missing Value	% of missing value
County Number	156731	1%
County	156729	1%
Category	16974	0%
Category Name	25040	0%
Vendor Number	5	0%
Vendor Name	3	0%
Item Number	0	0%
Item Description	0	0%

# Completeness of data

Columns name	Number of Missing Value	% of missing value
Pack	0	0%
Bottle Volume (ml)	0	0%
State Bottle Cost	10	0%
State Bottle Retail	10	0%
Bottles Sold	0	0%
Sale (Dollars)	10	0%
Volume Sold (Liters)	0	0%
Volume Sold (Gallons)	0	0%

# Basic information

## Number of ...

County	99
Stores	2484
Category	110

Vendor	348
Item	11709

## Uniqueness

No duplicated data

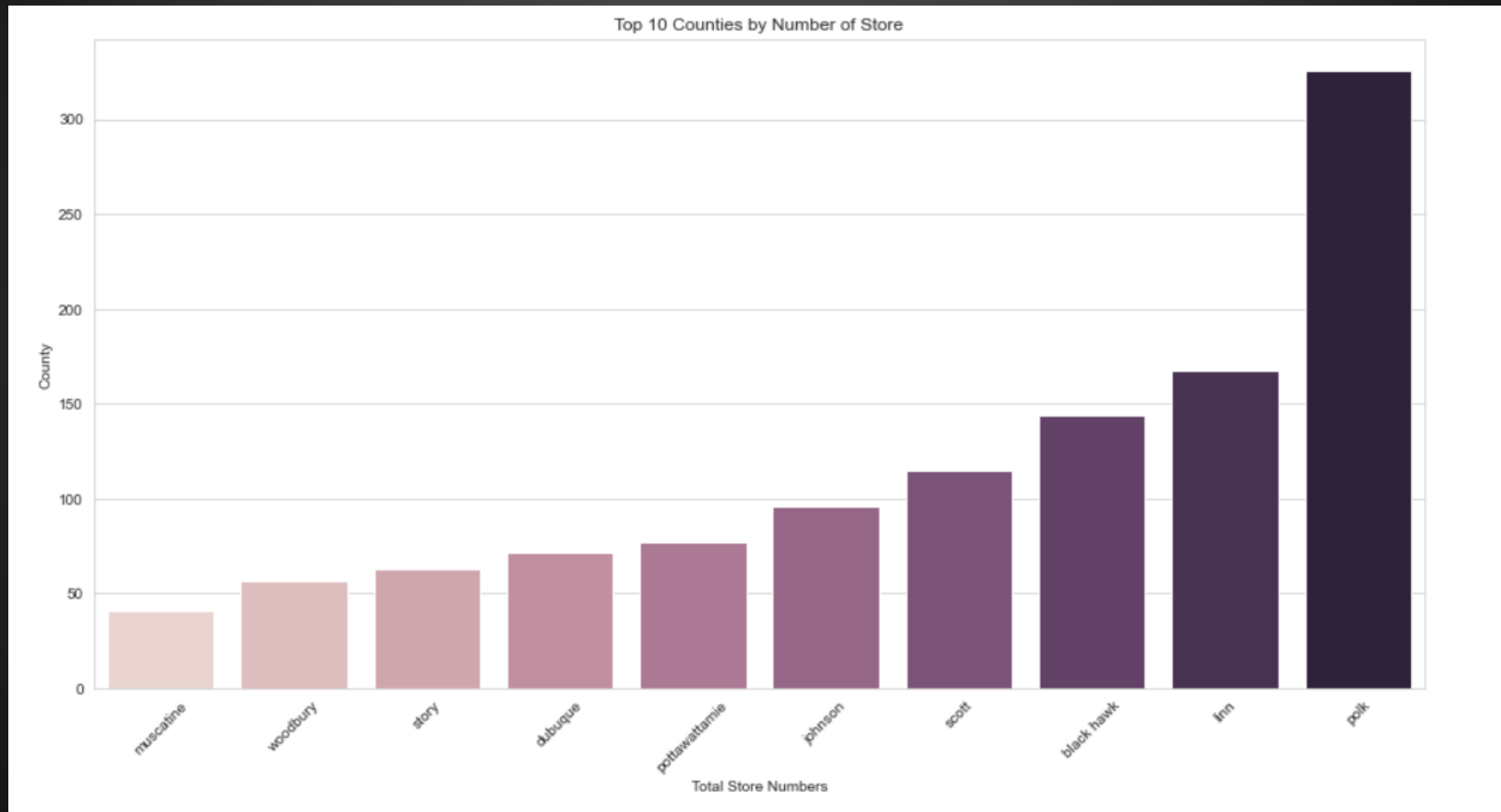
## Accuracy

Meaningless text in **Store Name**, with some punctuations and numbers.

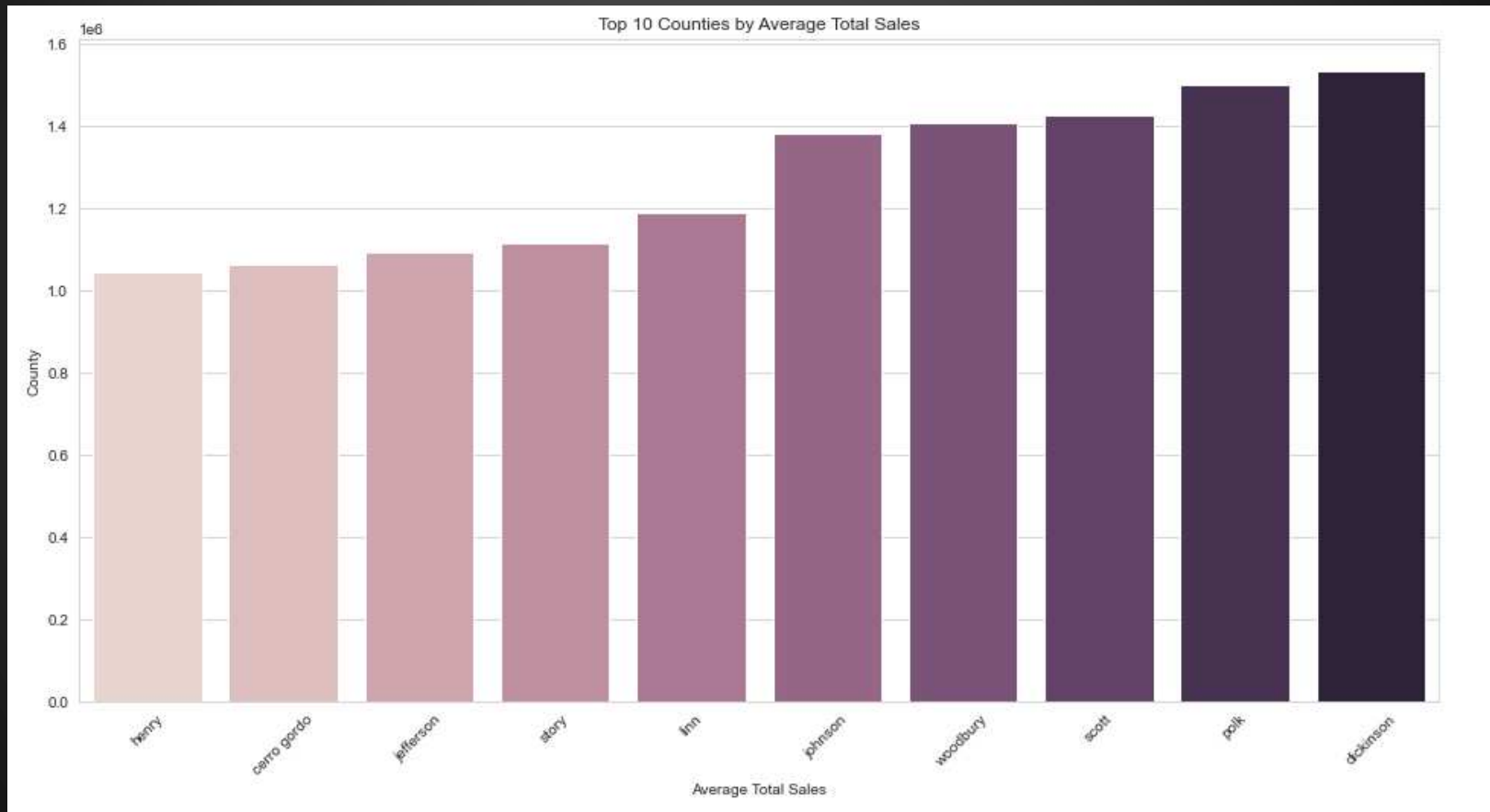
Different **Item Number** but same **Item description**

Negative values in **Pack** & **Bottles sold**

# Number of stores information



# Top 10 counties by Store Average Total Sales



# END

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