

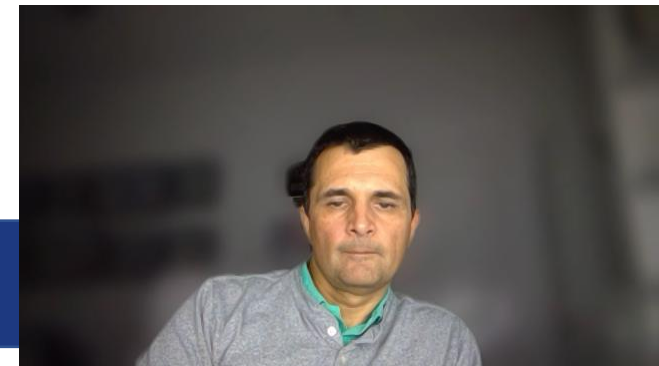
Using Sentiment Analysis on 10-k Filings to Predict Oil Prices

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Data 698: Analytics Master's Research Project

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Introduction

Can SEC filings predict the price of a commodity?



Natural Language Processing (NLP) techniques such as Sentiment Analysis are finding their way into Financial Analysis

This study attempts to prove that it is possible to predict the price of a commodity from the content of the Security and Exchange Commission (SEC) 10-K filings.

Commodity: Oil

Literature Review

Has this been researched already?



Assessment of Sentiment Analysis on company fillings - G. H. Soong and C. C. Tan (2021)

Sentiment Analysis on non-filling data to predict company stock price - Gao, Kampas, and Rinne (2018)

SEC fillings contain broader market information - U.S. Securities and Exchange Commission, "How to Read a 10-K," 2011

Sentiment Analysis on reports used to determine investors' perception of risk - Bao and Datta (2014)

Risk in the financial Sector prediction from report's Sentiment - Rolnicki. (2018)



No studies on predicting the price of a commodity

Hypothesis

The goal of the study



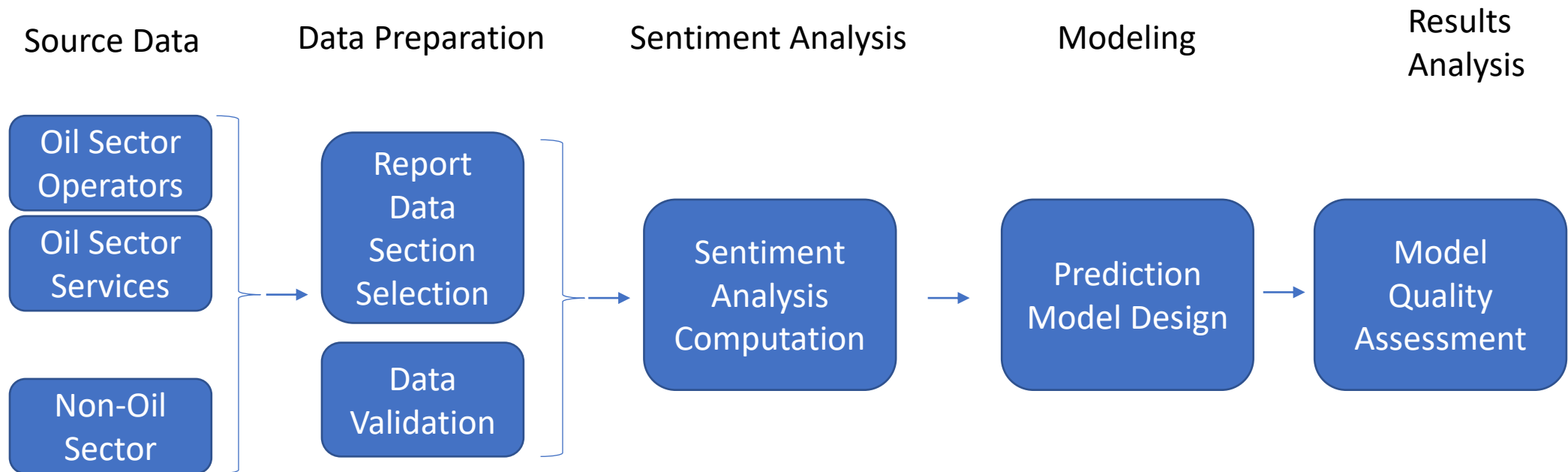
Hypothesis 1: it is possible to design a linear regression prediction model that, with *reasonable accuracy*, can predict the price of oil from SEC 10-K report filings' computed Sentiment Data.

Hypothesis 2: it is possible to design a regression model that explains oil prices using Sentiment data from SEC 10-K reports as the predictor variable.

Hypothesis 3: SEC 10-K reports from companies that operate directly in the oil sector produce better Sentiment based regression models for oil prices than companies that do not directly operate in the oil sector.

Methodology

How the study performed the Analysis

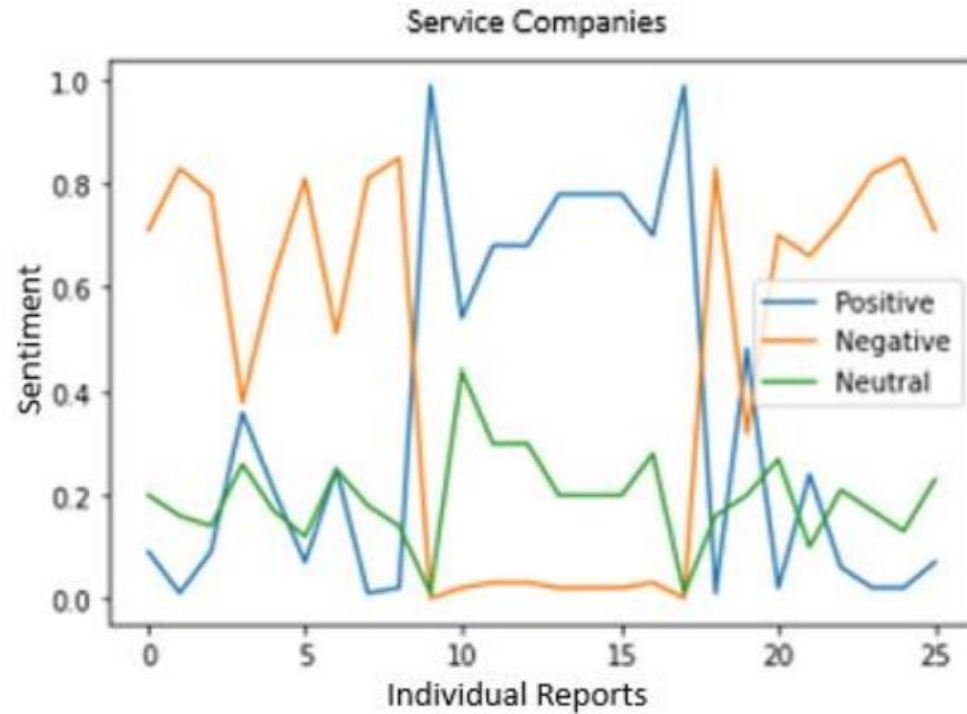


Study Results

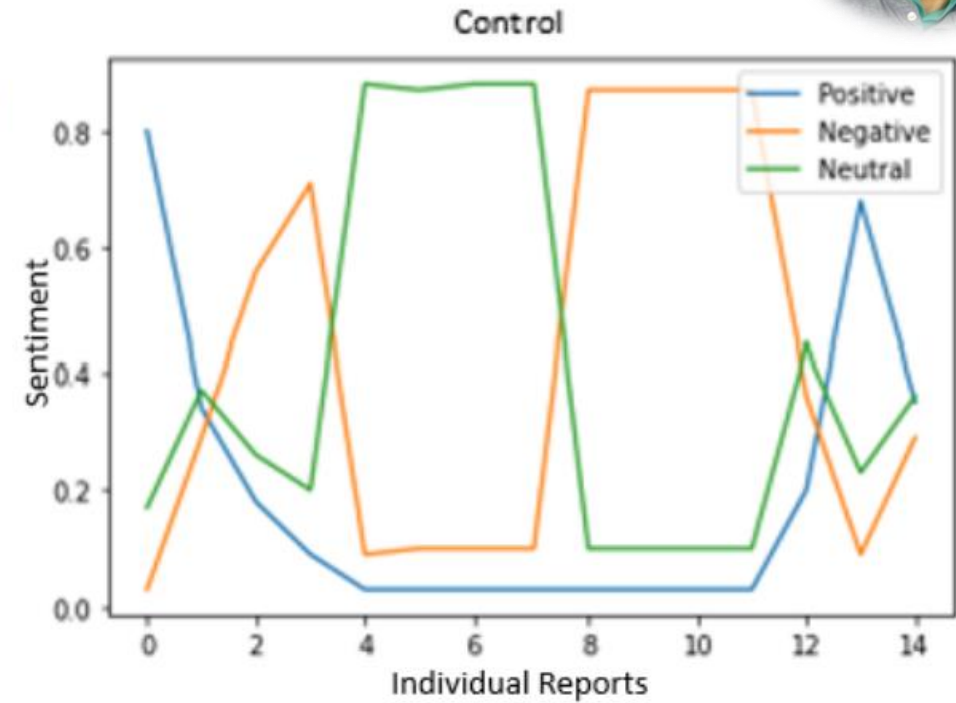
Study findings



A)



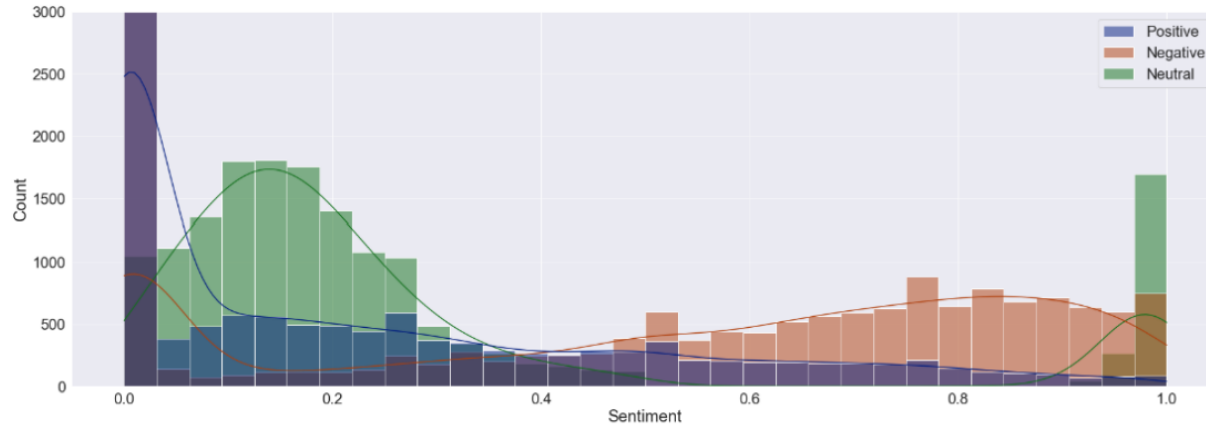
B)



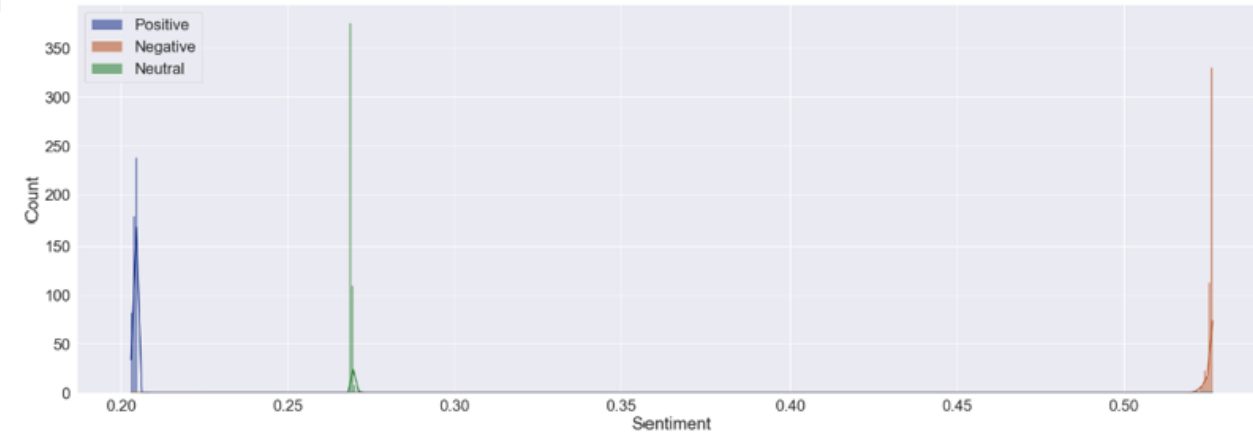
Issues found when analyzing entire reports

Study Results

Study findings



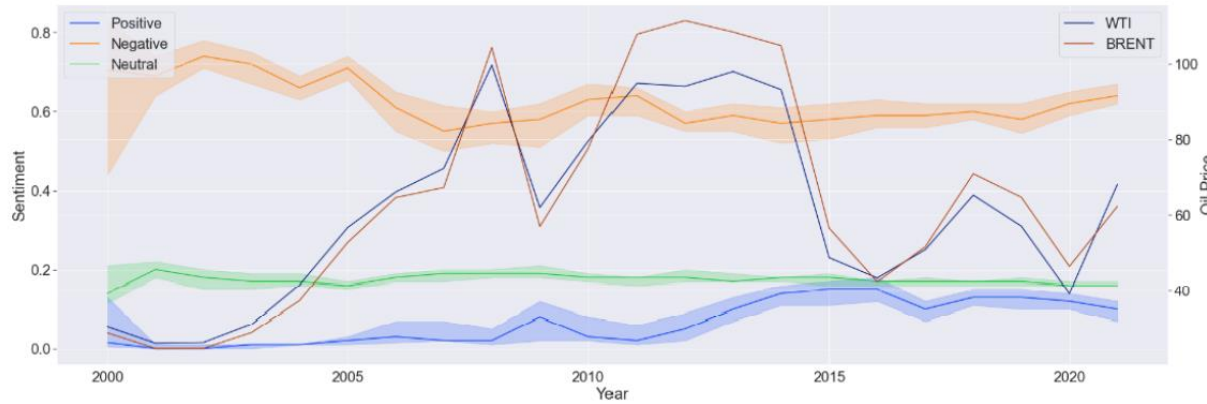
Histogram plot of Sentiment Data in study



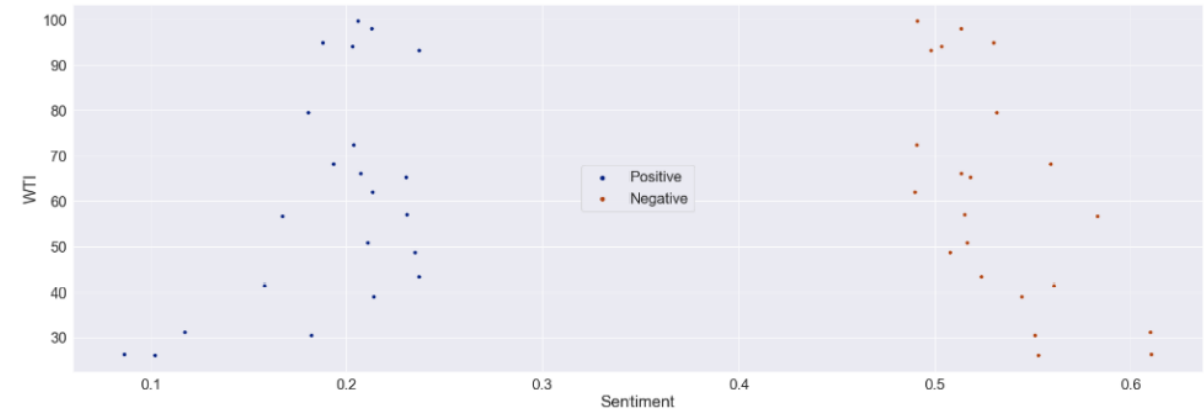
Bootstrap Sentiment data distributions for 2015

Study Results

Study findings



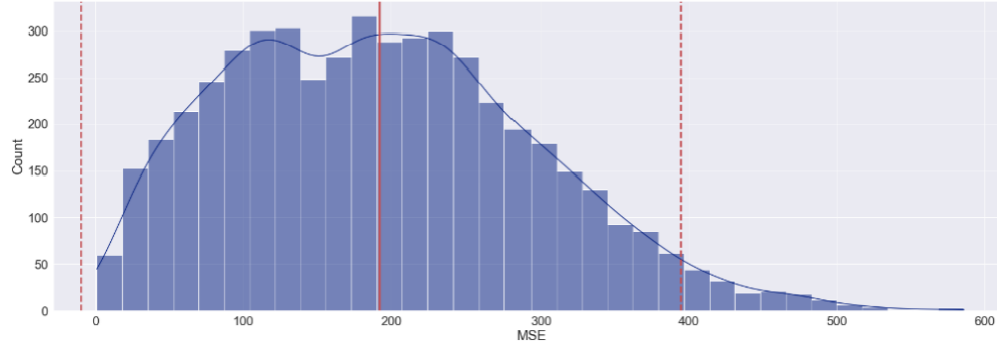
Histogram plot of Sentiment Data in study



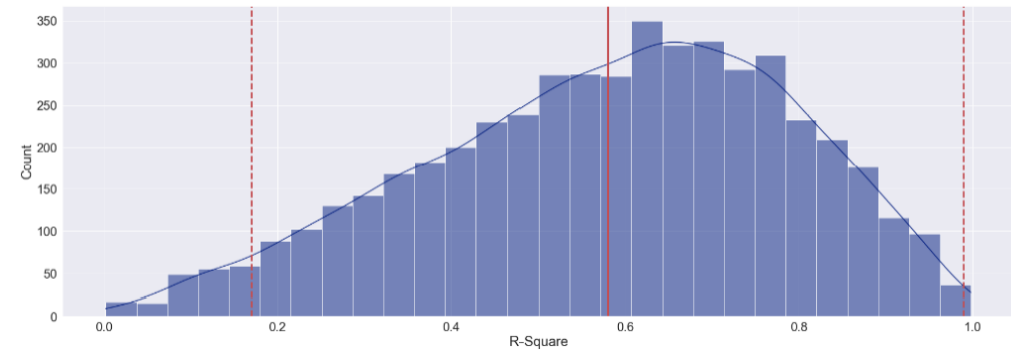
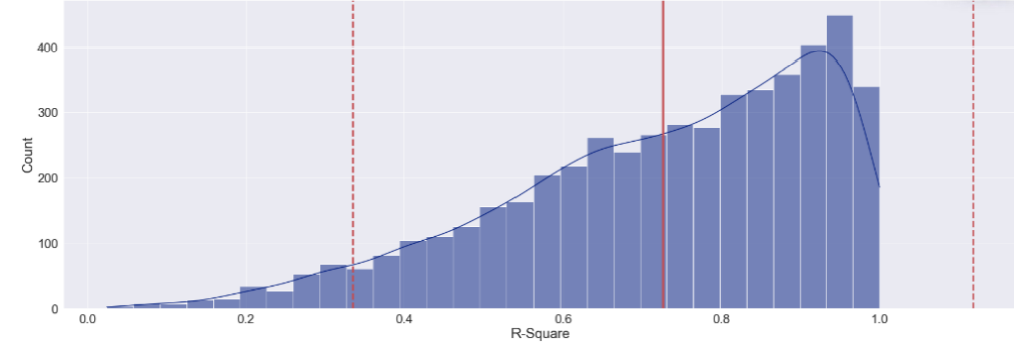
Positive and Negative Sentiment vs. WTI oil price

Study Results

Study findings



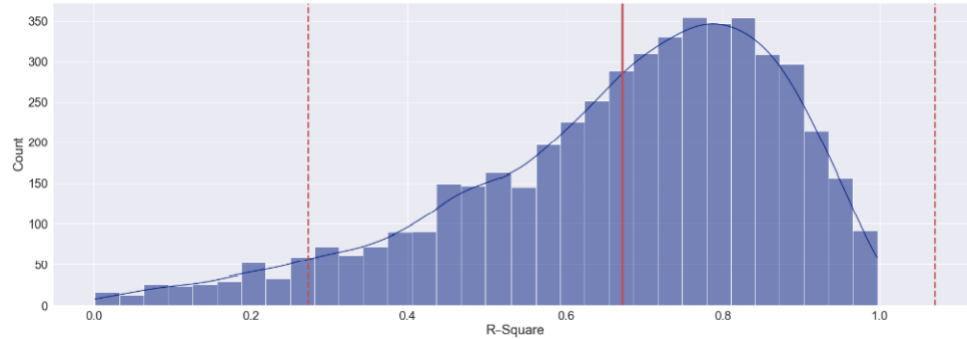
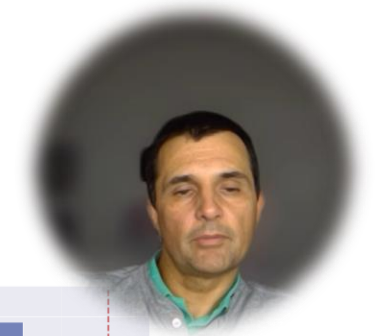
No model with an MSE of \$2 was found



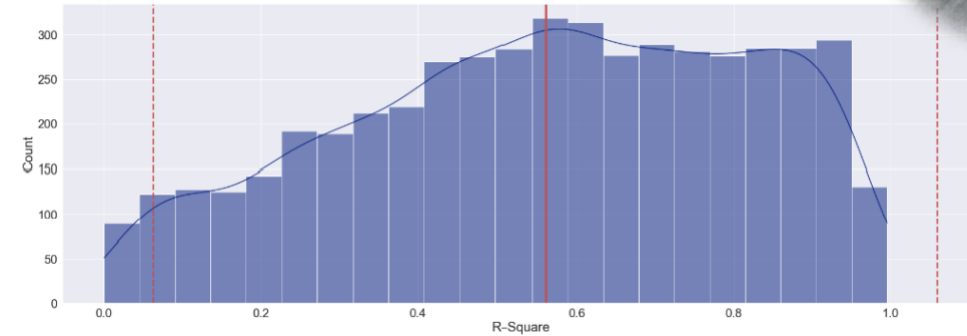
Certain combinations of Sentiment produced better correlations

Study Results

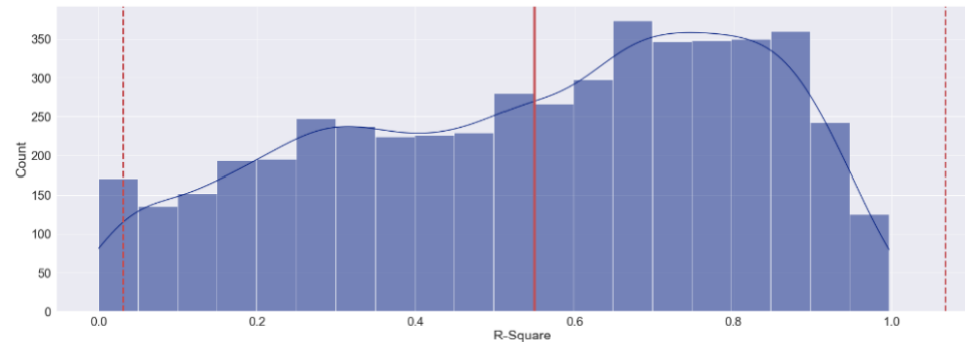
Study findings



Linear Model generated with Operator and Service Companies



Linear Model generated with Operator companies



Linear Model generated with Service Companies

Conclusions



- Models to predict the price of a commodity were not generated in this study
- Model that explain the price of a commodity were produced, but of low quality
- Model using commodity sector specific companies produced lower quality models