



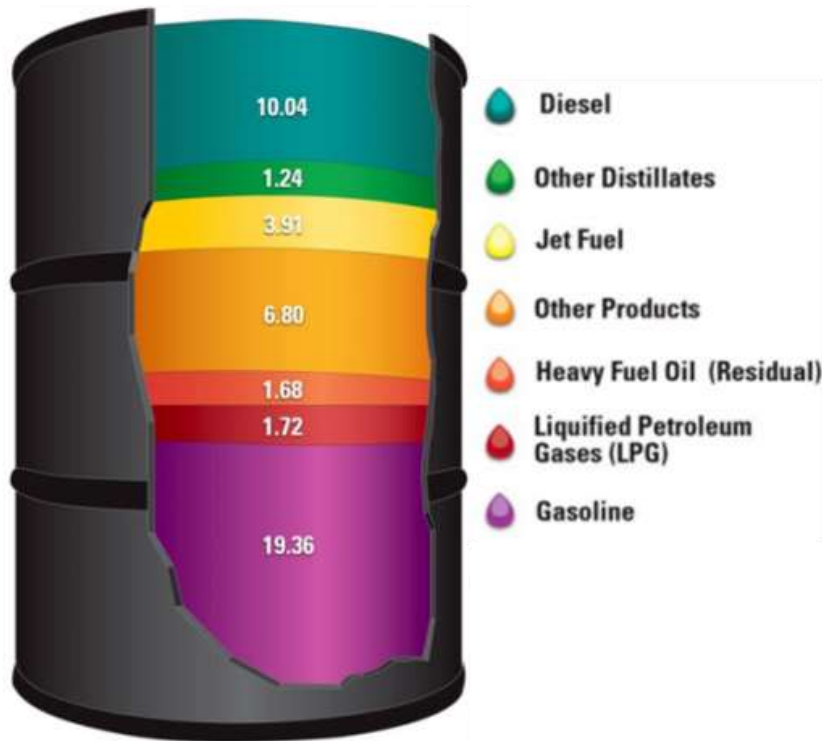
# Forecasting Crude Oil Price in United States

---

Zoe Zhu IDS702 Fall 2020



## Products Made from a Barrel of Crude Oil (Gallons) (2009)



## What is Crude Oil?

- **Crude oil:**
  - Fossil fuel, non-renewable
  - A mixture of hydrocarbon deposits & other organic materials
- **Refining:**
  - Transforming crude oil into more useful products like gasoline, diesel, etc.



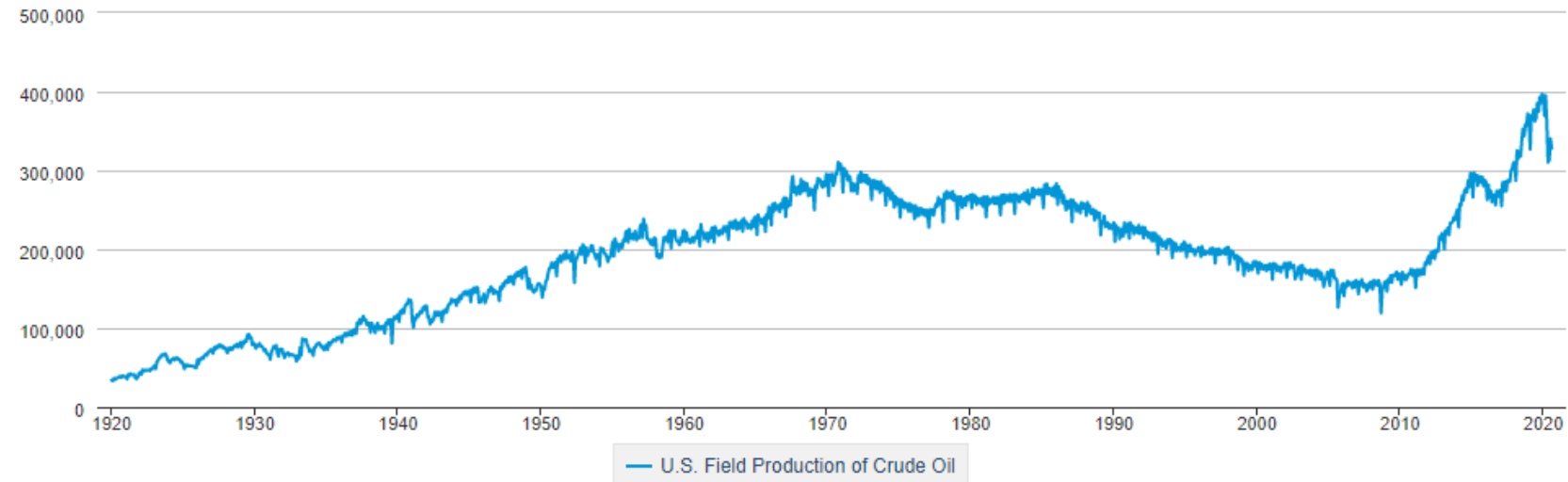
## What drives the price?

---

- Supply
- Global economy
- Political uncertainty

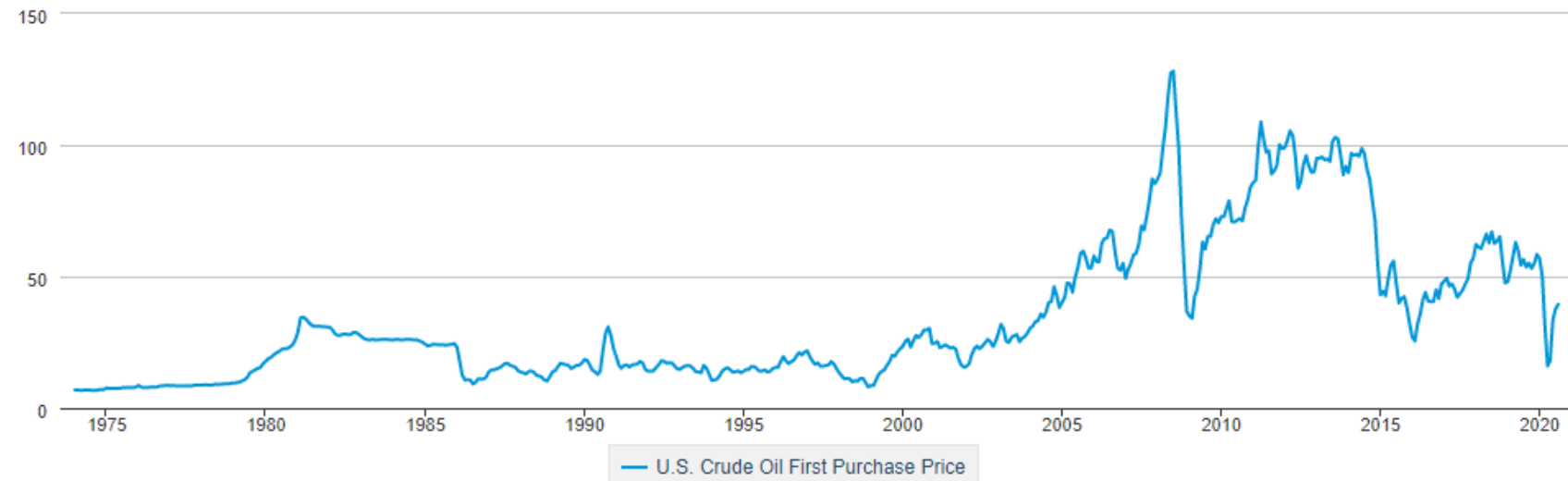
## U.S. Field Production of Crude Oil

Thousand Barrels



## U.S. Crude Oil First Purchase Price

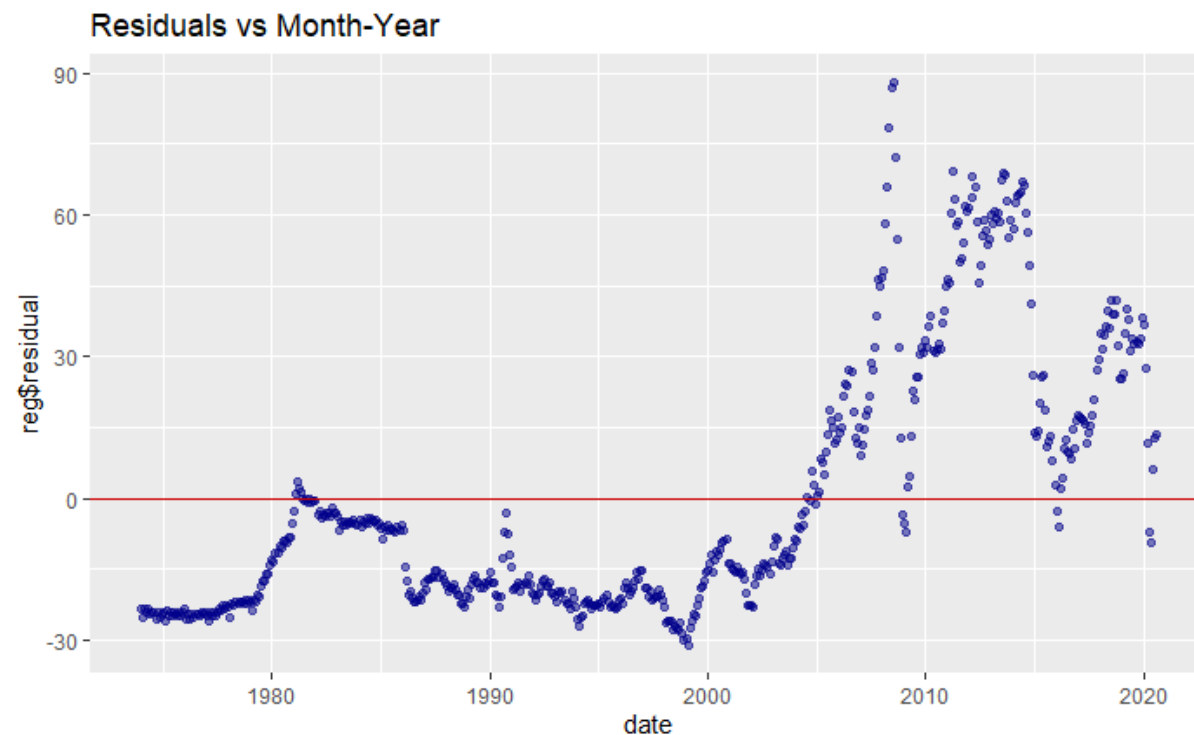
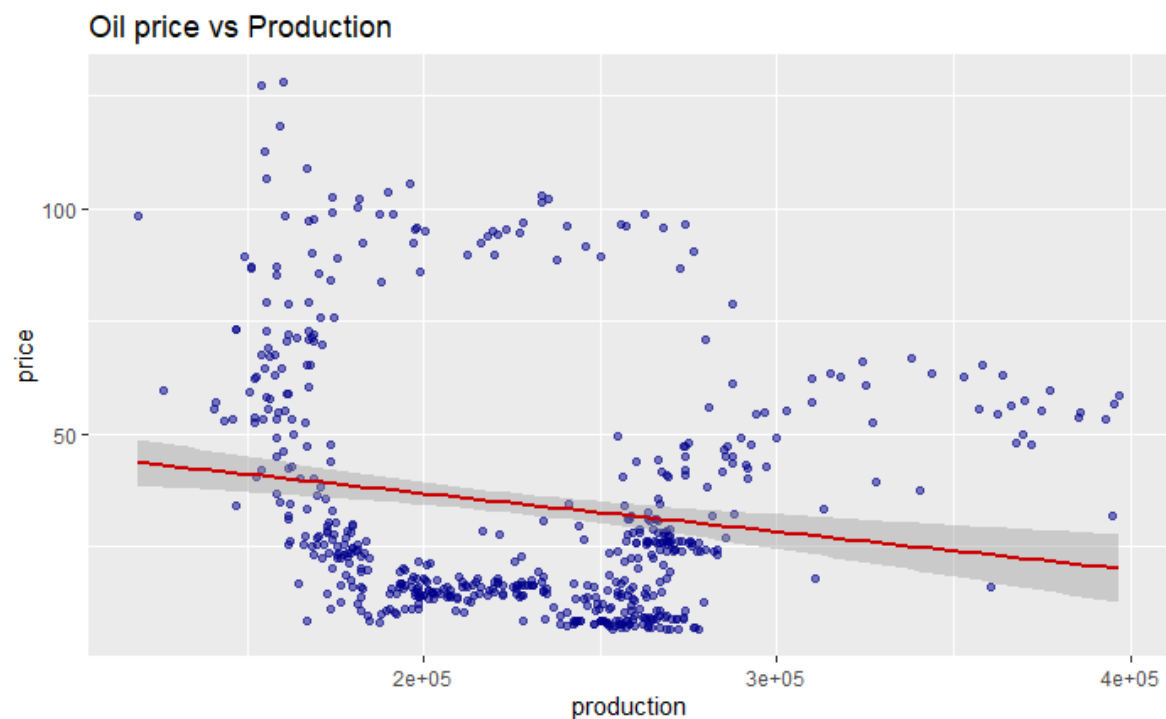
Dollars per Barrel



# Fitting a linear regression

## Oil price vs production

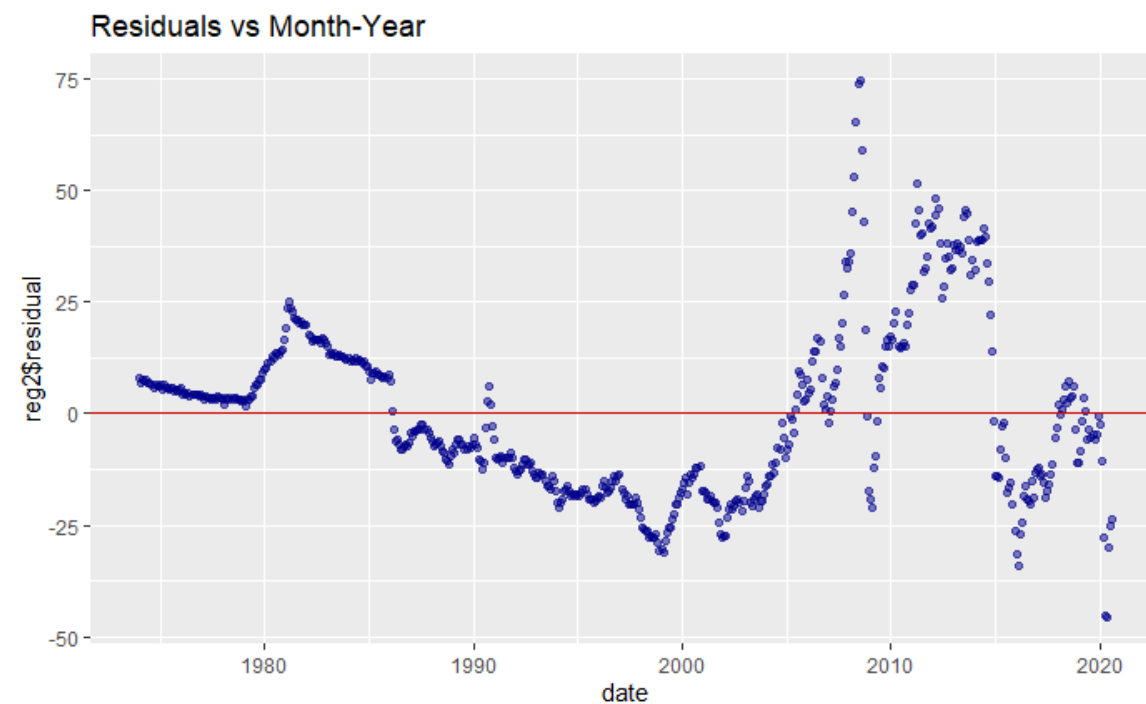
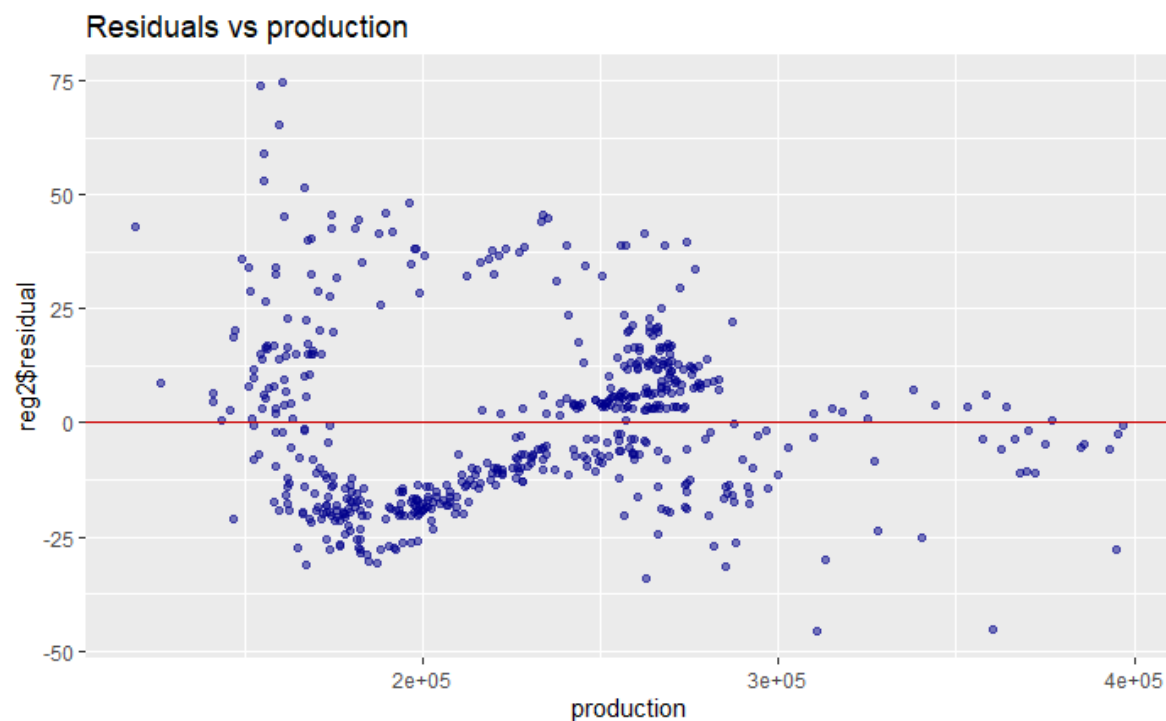
**Non-stationary!**



# Fitting a linear regression

Oil price vs  
production & time

**Non-stationary!**

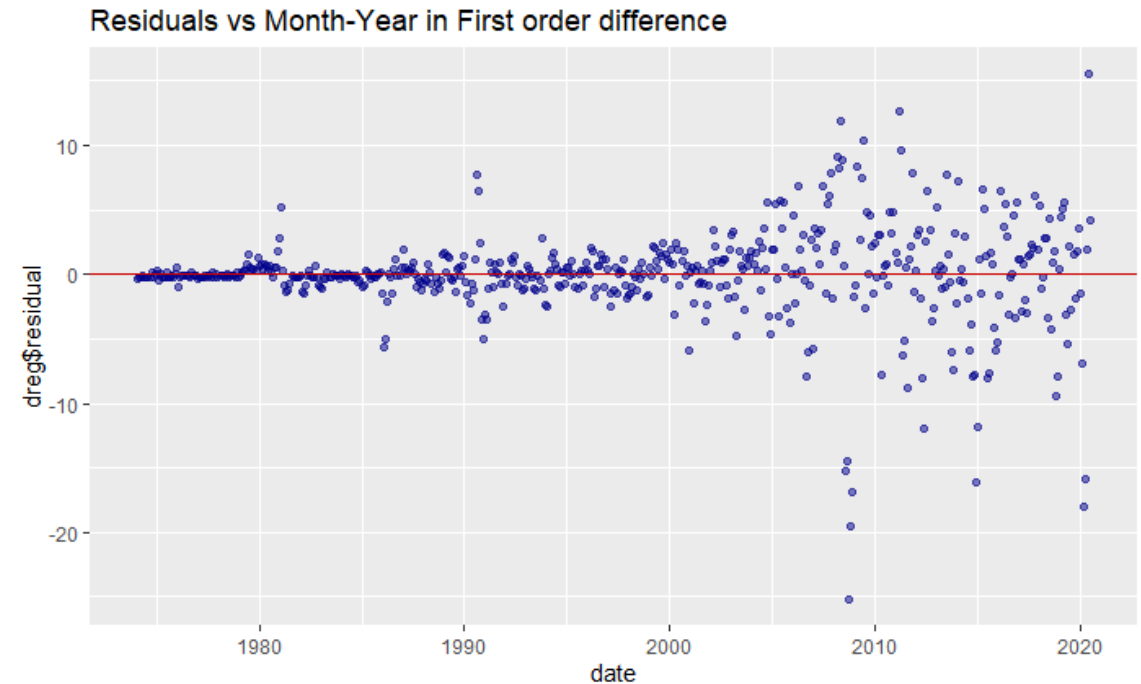
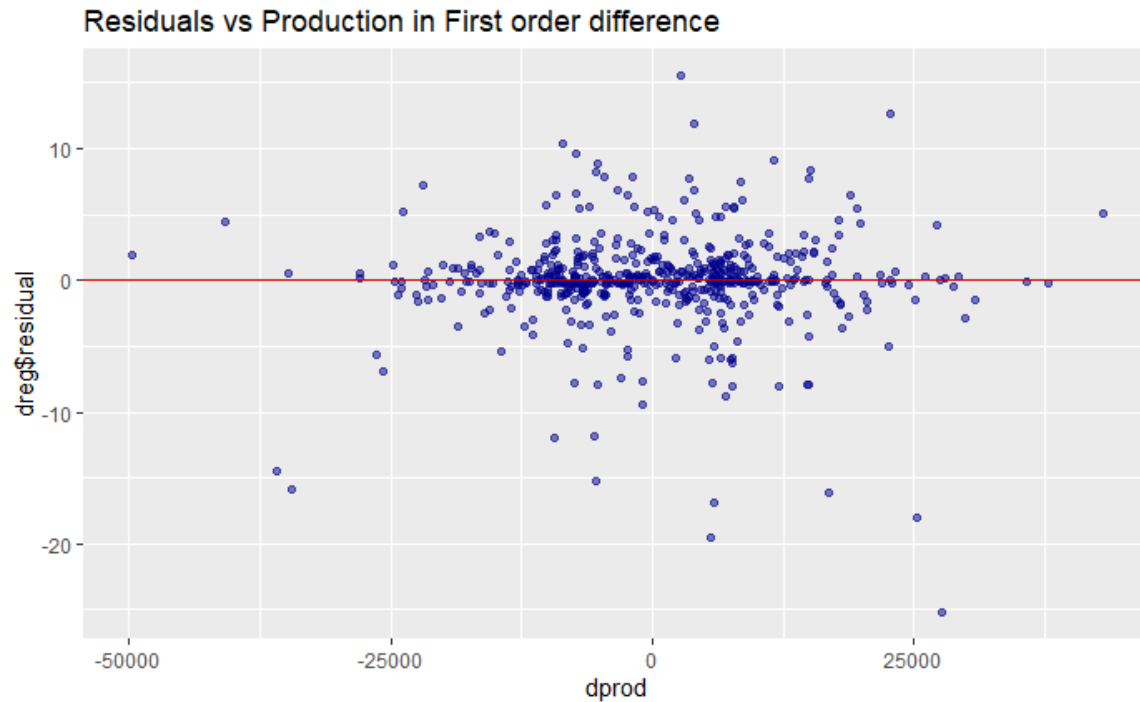


# Differencing: first order difference

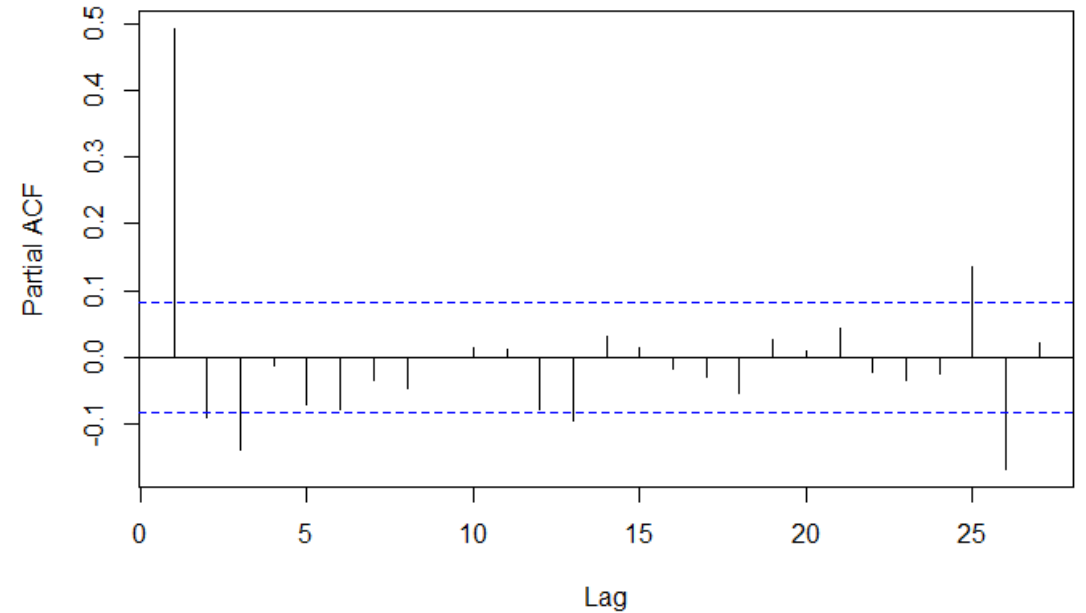
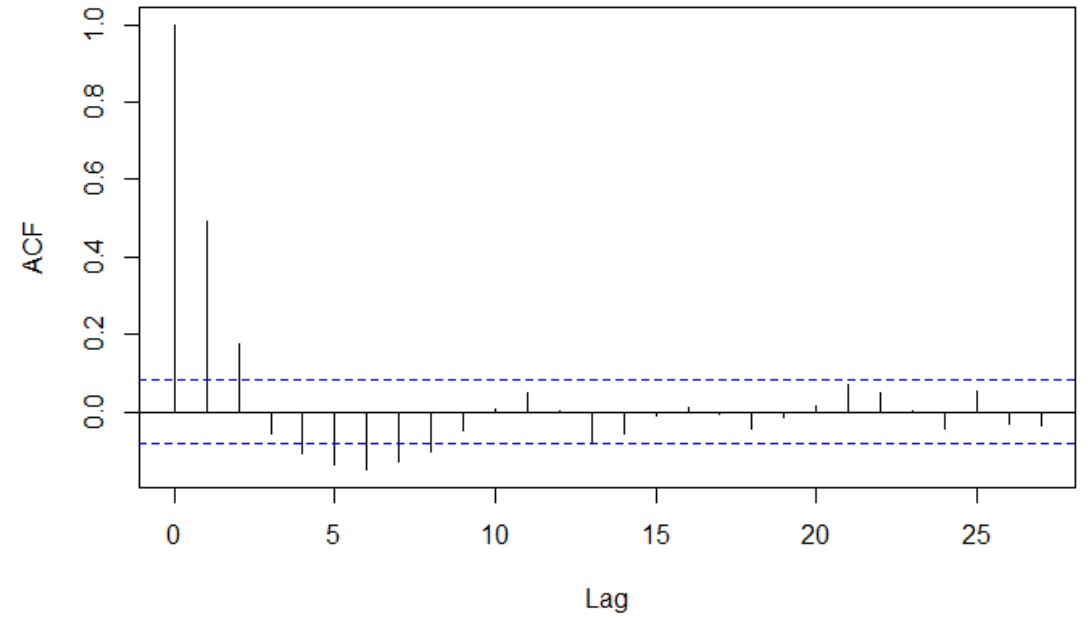
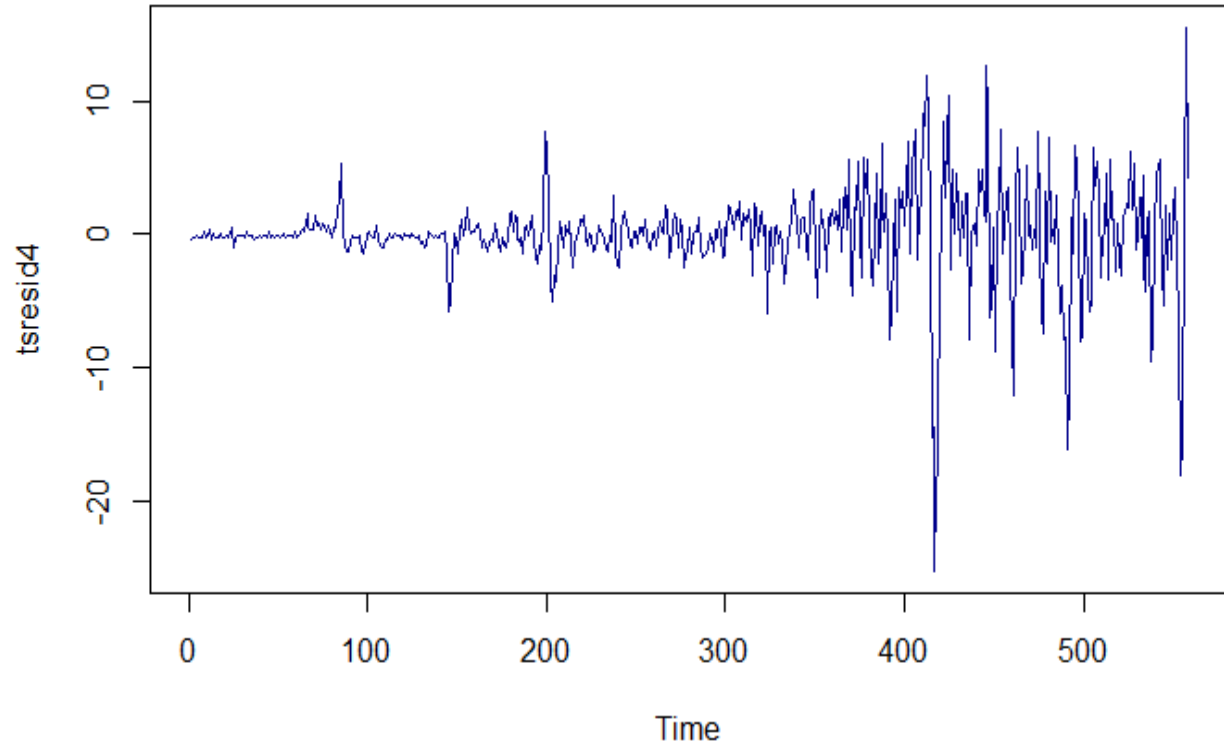
Difference in oil production = production of current month – production of previous month

Difference in oil price = price of current month – price of previous month

**(Weak) Stationary!**



# First order difference Residuals





```
call:
lm(formula = dprice ~ dprod + date, data = oil2)
```

```
Residuals:
```

	Min	1Q	Median	3Q	Max
	-25.1847	-0.8277	-0.0128	1.1303	15.5236

```
Coefficients:
```

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	2.048e-01	3.494e-01	0.586	0.558
dprod	-4.625e-06	1.310e-05	-0.353	0.724
date	-1.499e-05	3.146e-05	-0.476	0.634

```
Residual standard error: 3.64 on 555 degrees of freedom
Multiple R-squared: 0.0006602, Adjusted R-squared: -0.002941
F-statistic: 0.1833 on 2 and 555 DF, p-value: 0.8325
```

```
Series: oil2$dprice
```

```
Regression with ARIMA(2,0,1) errors
```

```
Coefficients:
```

	ar1	ar2	ma1	xreg1	xreg2
	1.3786	-0.5126	-0.8651	0	0
s.e.	0.0686	0.0387	0.0709	0	0

```
sigma^2 estimated as 9.688: log likelihood=-1423.07
AIC=2858.15 AICc=2858.3 BIC=2884.1
```

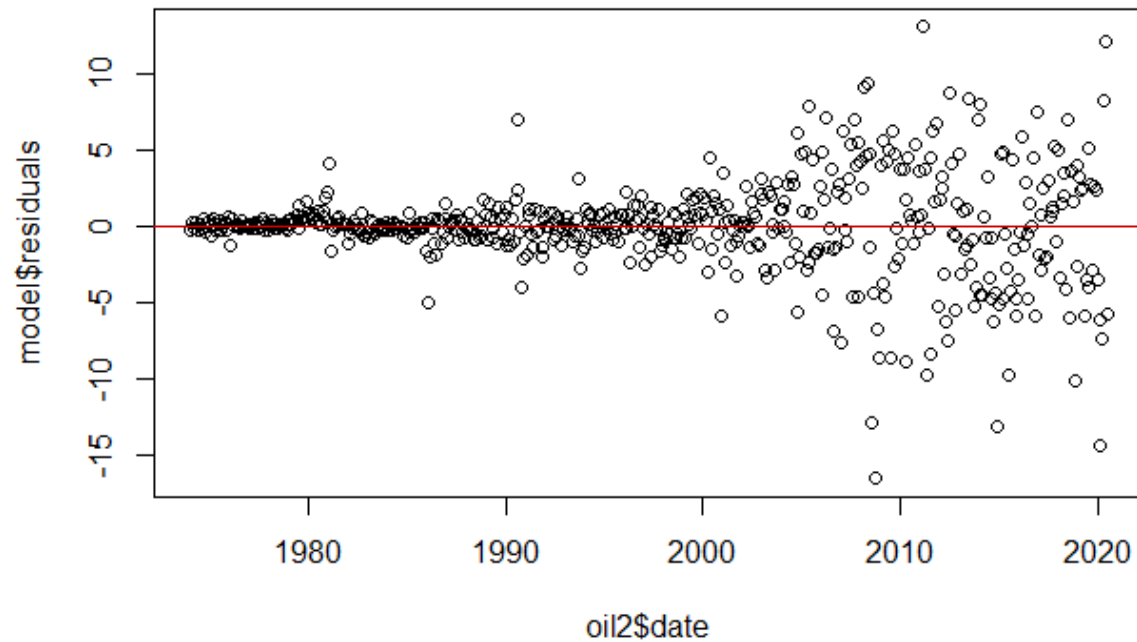
## Fitting ARIMA Model

ARIMA(2,0,1)

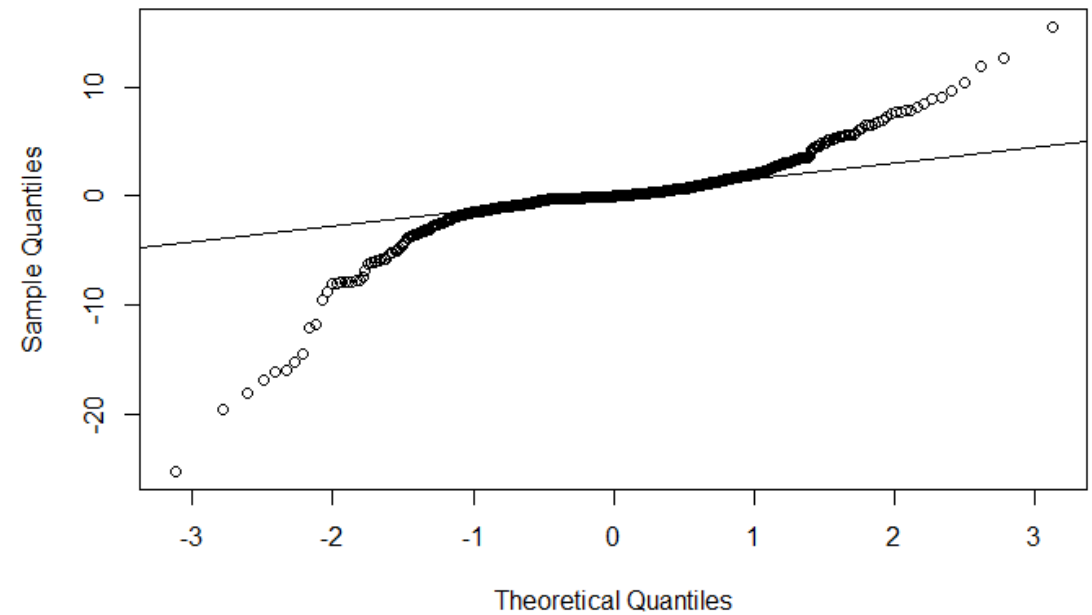
For Residuals

# Model assumptions

Residuals vs Month-Year



Normal probability plot of residuals



# What's next?

1

Add an indicator variable for Financial crisis of 2007–2008

2

Split data for model fitting & forecasting

- Exclude data after Mar 2020 (influenced by covid-19 pandemic)



**Thank you for watching!**

# Reference

What is Crude Oil?

<https://www.youtube.com/watch?v=2WRy1ekd2eU>

Crude Oil Prices Explained - WTI vs Brent

<https://www.youtube.com/watch?v=Yp4wFZeY0fk>

Oil and petroleum products explained - *Refining crude oil*

<https://www.eia.gov/energyexplained/oil-and-petroleum-products/refining-crude-oil-the-refining-process.php>