

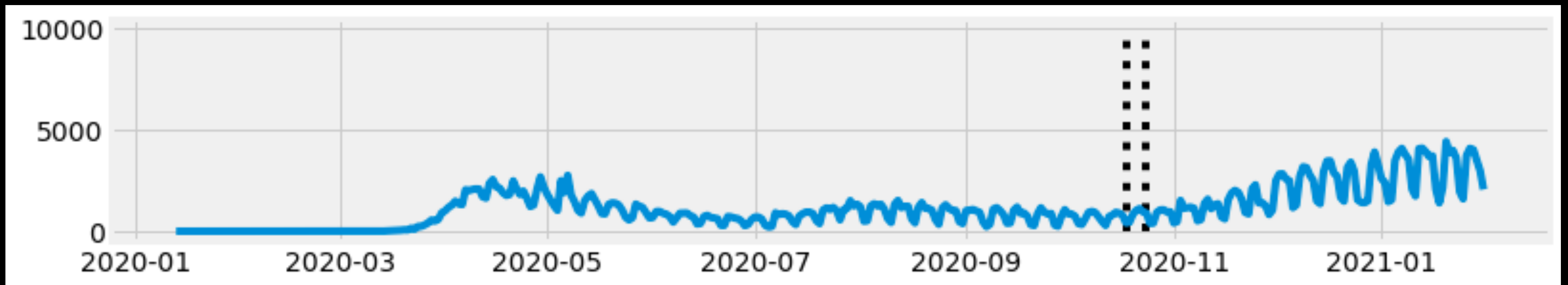
# **Coronavirus Prediction**

**Predicting daily numbers of deaths and mortality rates for the US  
with data sourced from covidtracking.com api**

**Authors: Ning Chen and Elliot Macy**

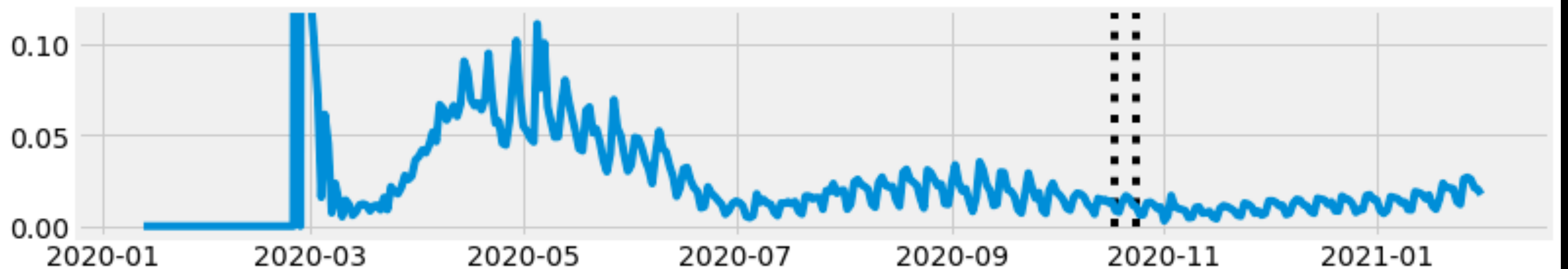
# New Deaths per day

- Weekly seasonality
- Dips on weekends
- Peaks on Mondays
- Reporting?



# Mortality Rate per day

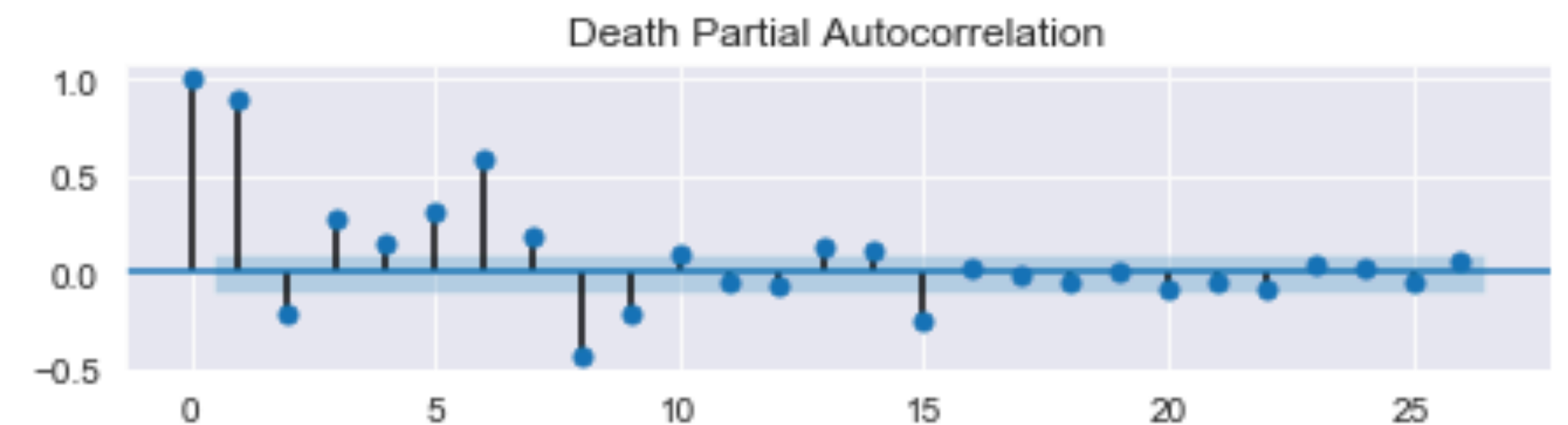
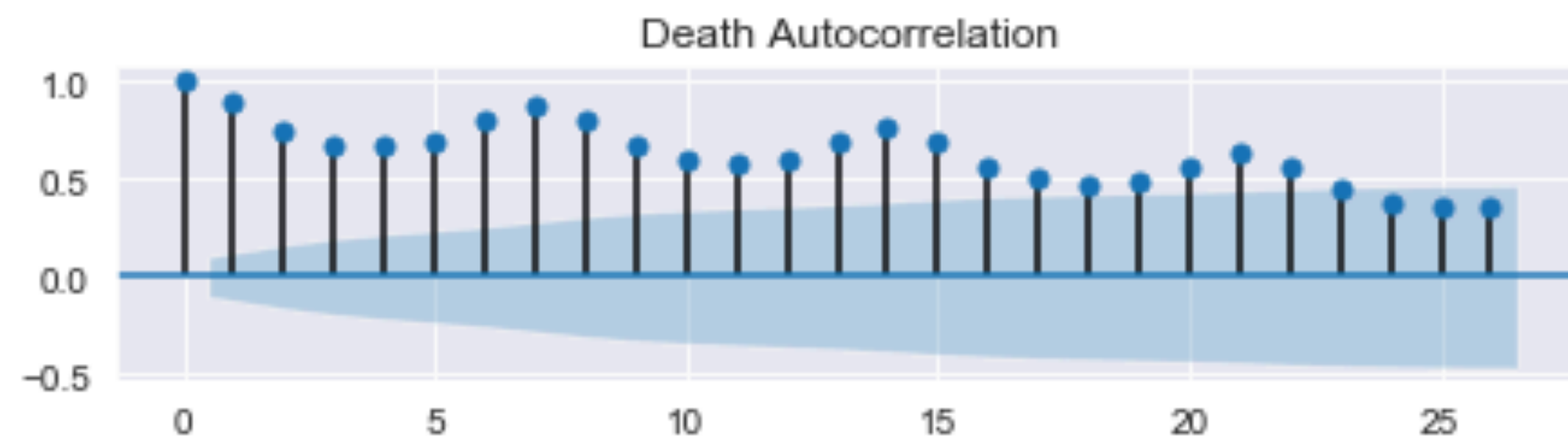
- Weekly seasonality
- Dips on weekends
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- Reporting?



# ACF/PACF

Auto Correlation Formula  
/ Partial Auto Correlation Formula

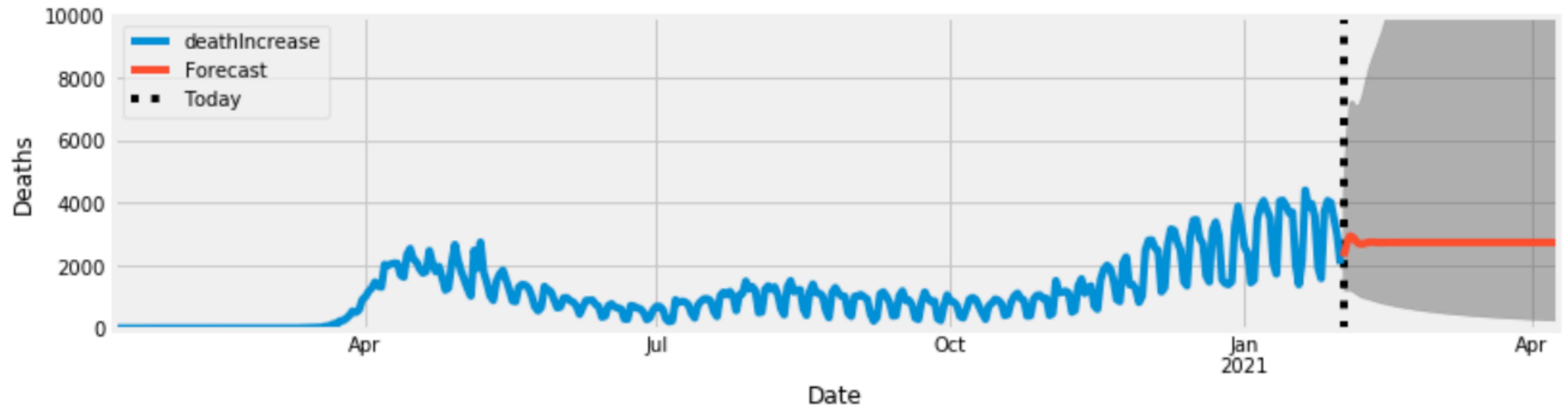
- Weekly seasonality
- Dips on weekends
- Peaks on Mondays
- Reporting?



# ARIMA

Auto Regressive Integrated Moving Average

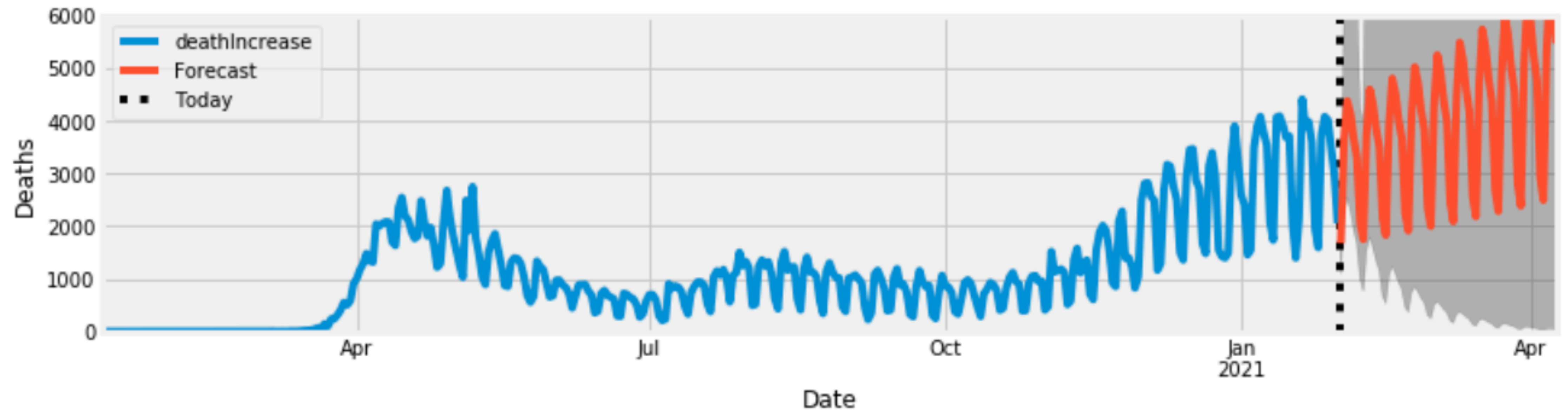
- Non-Dynamic RMSE = 1414.04
- Non-Dynamic MAE = 1174.88
- Dynamic RMSE = 1941.94
- Dynamic MAE = 1599.49
- (Stationarity violated)



# SARIMAX

Seasonal Auto Regressive Integrated Moving Average  
with eXogenous regressors

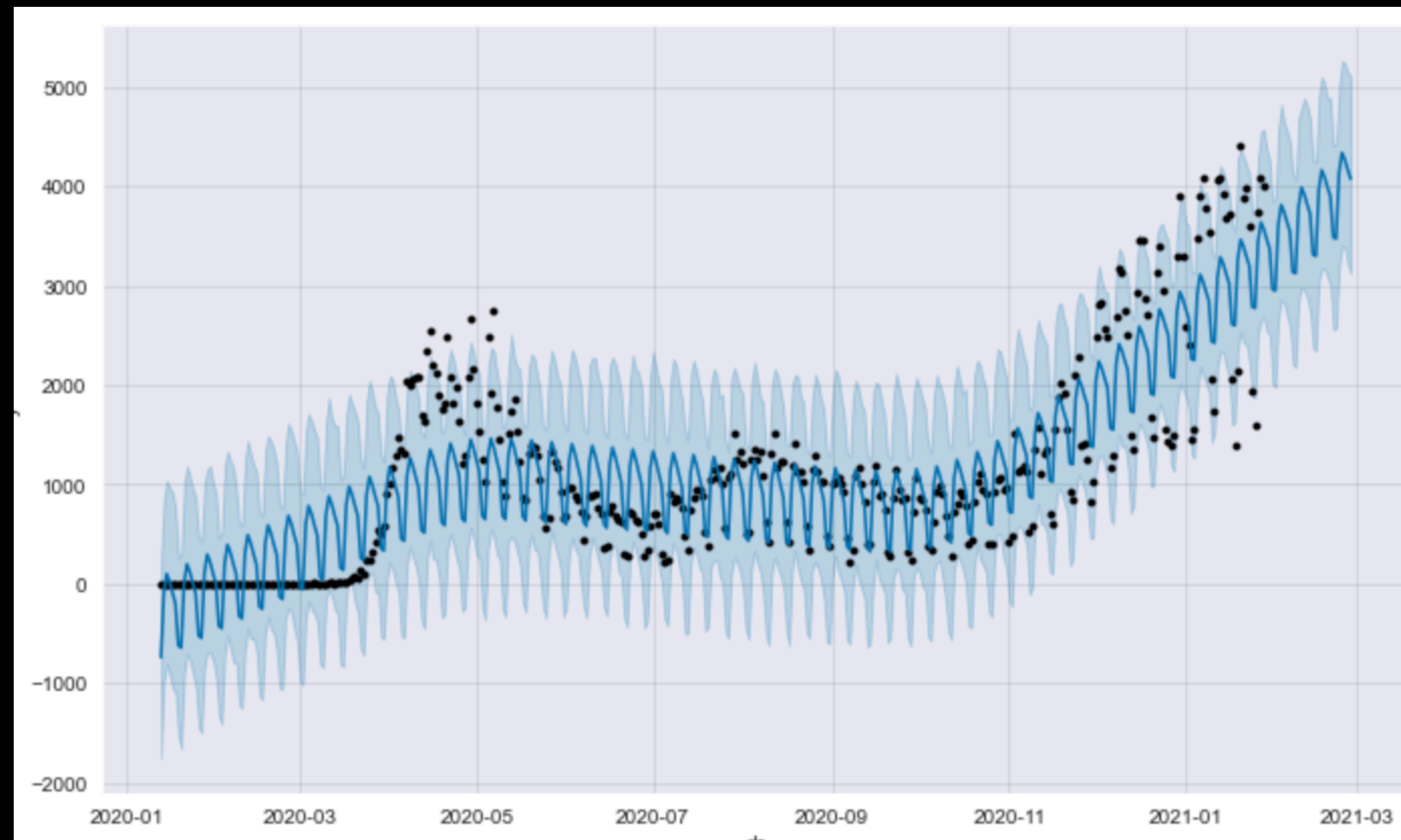
- Non-Dynamic RMSE = 1464.89
- Non-Dynamic MAE = 1183.11
- Dynamic RMSE = 1743.65
- Dynamic MAE = 1363.64





# Facebook Prophet

- Train RMSE = 432.03
- Train MAE = 321.32
- Test RMSE = 1929.95
- Test MAE = 1579.82



# LSTM

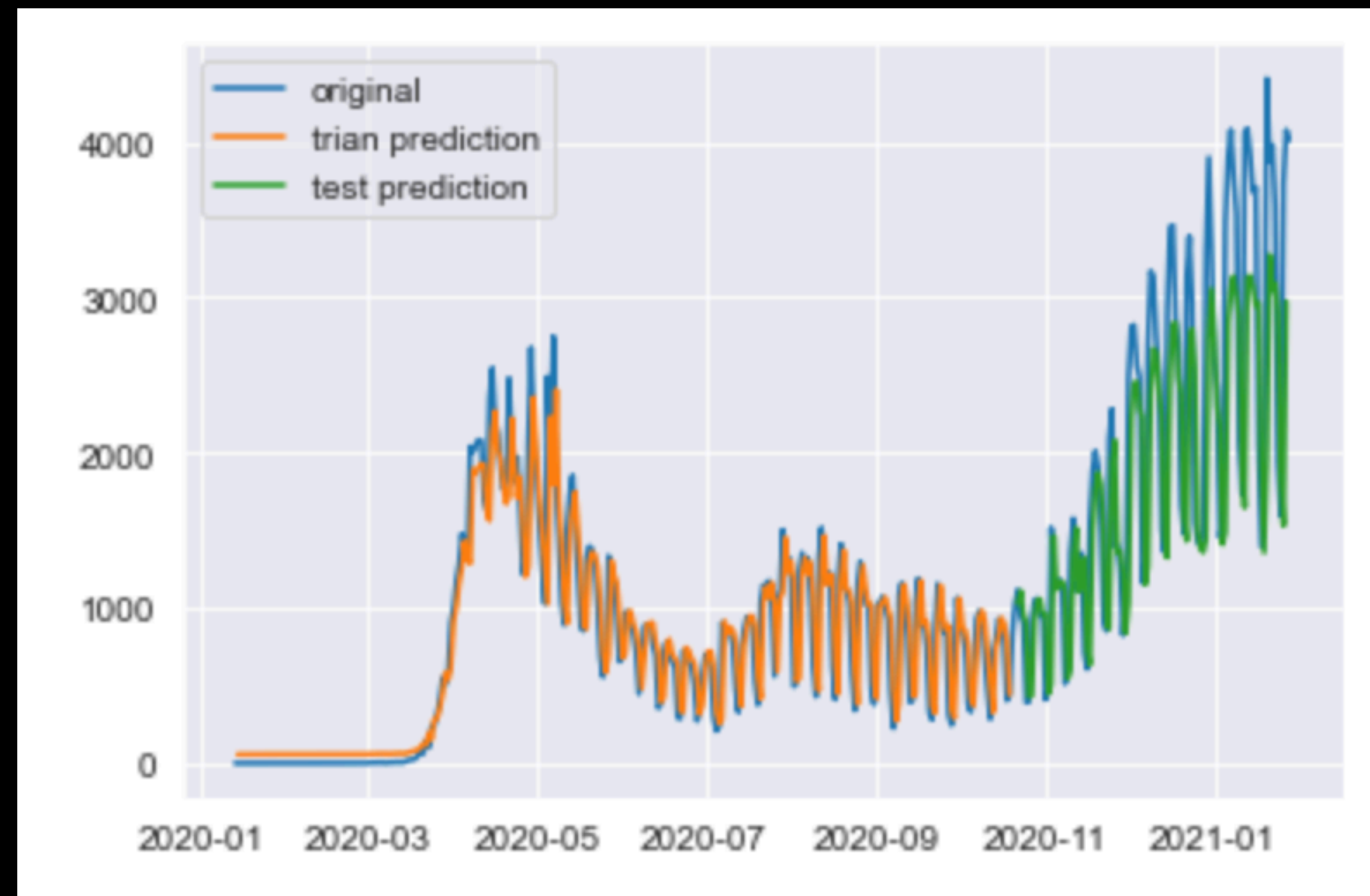
## Long Short-Term Memory

- Train RMSE = 275.27

- Train MAE = 788.28

- Test RMSE = 183.45

- Test MAE = 563.24





# Model Evaluation

## RMSE / MAE

### ARIMA:

- Non-Dynamic RMSE = 1414.04
- Non-Dynamic MAE = 1174.88
- Dynamic RMSE = 1941.94
- Dynamic MAE = 1599.49
- (Stationarity violated)

### SARIMAX:

- Non-Dynamic RMSE = 1464.89
- Non-Dynamic MAE = 1183.11
- Dynamic RMSE = 1743.65
- Dynamic MAE = 1363.64

### FB Prophet:

- Train RMSE = 432.03
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- Test RMSE = 1929.95
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### LSTM:

- Train RMSE = 275.27
- Train MAE = 788.28
- Test RMSE = 183.45
- Test MAE = 563.24

# Conclusions

## and Recommendations

1. LSTM Network serves as the best model for coronavirus prediction (smallest RMSE and MAE)
2. SARIMAX with optimized hyperparameters by Gridsearch also works well for predictions
3. Due to many unknown exogenous features, such as transmission rate and the effect of holidays/lockdowns it is difficult to make precise predictions
4. Fewer deaths (and positive cases) on weekends and spikes on Mondays suggest errors in reporting
5. Based on LSTM, new deaths appear to be leveling off, however there is a wide confidence interval, so we recommend being cautiously optimistic