



## **Use Case**

# **Virtual Sensor Modeling for Oil and Gas Rate** (Well Surveillance-Production)

## Objective

- Well surveillance is essential for reservoir characterization, managing production potential, and selecting activities to enhance production
- Typically, well rates (i.e., oil, water, and gas) are not directly measured all the time, however, with virtual sensors, it is possible to build and implement continuous *well rate estimation* (WRE) or known as *virtual rate estimators* (VRE)
- The relationship of flowing pressure as a function of liquid rate describes the steady-state well performance at any point in time
- This rate estimation requires consistent pressure-volume-temperature (PVT) data, fit-for-purpose production well tests, and reliable sensors

## Data Aggregated

### Predictors

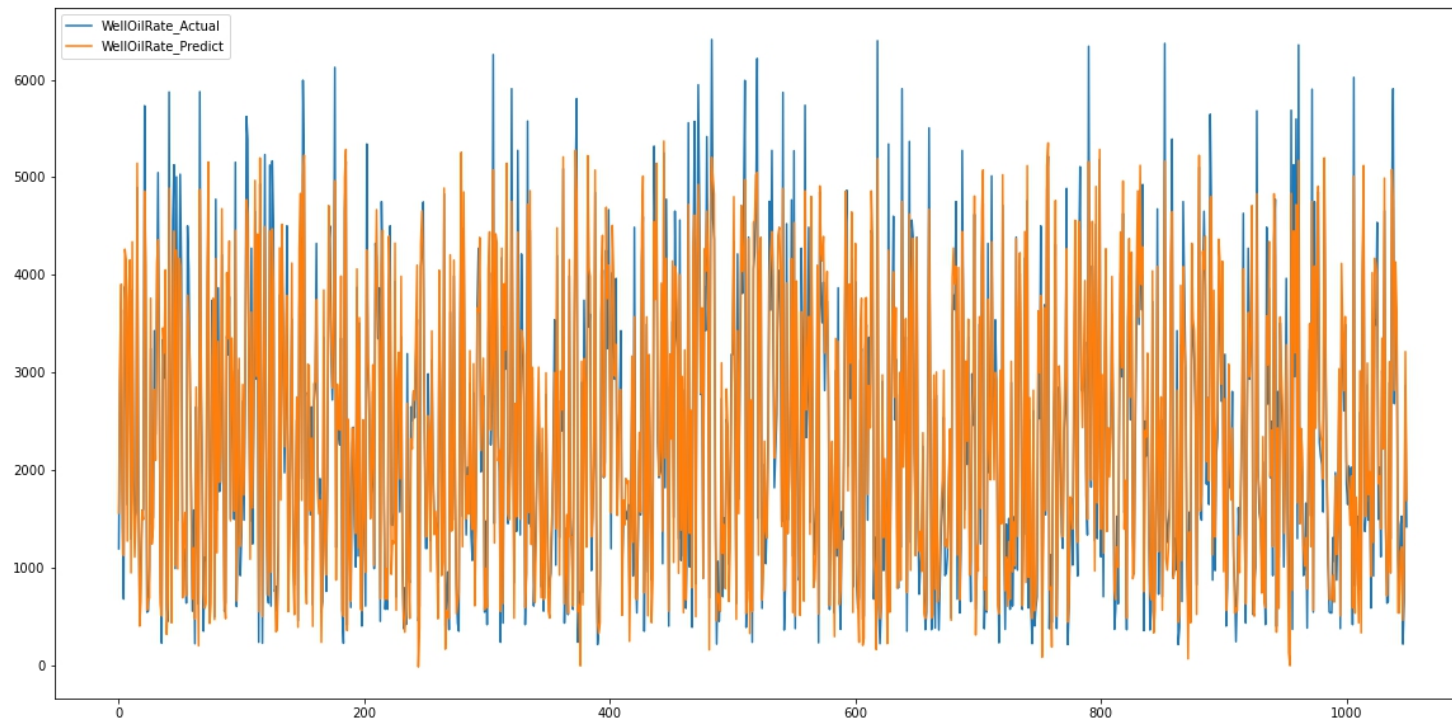
- Bottomhole pressure (BHP)
- Wellhead pressure (WHP)
- Wellhead temperature (WHT)
- Separator pressure (Psep)
- Separator temperature (TSep)
- Chokes internal diameter (ID\_Choke)

### Target Variables

- Oil Rate(bbls)
- Gas Rate(bbls)

## Oil rate

- Linear regression and random forest regressor were used to map the target parameter, Oil rate.
- This soft-sensor can be utilized to monitor the production performance of the well at any point in time.
- This model can be compared with the theoretical capability of the well to produce oil using Darcy's equation.



Predicted vs Actual Oil Rate

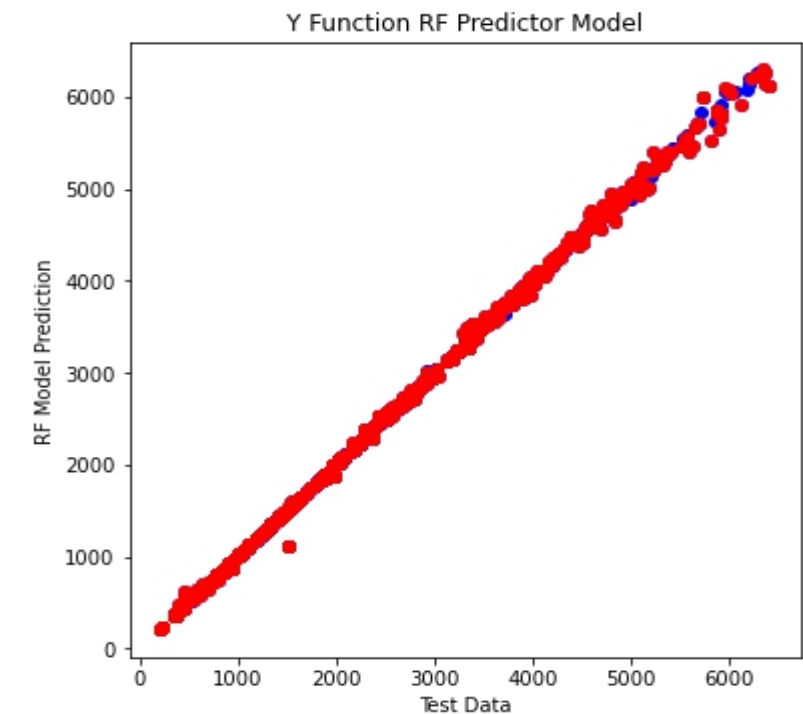
## Model Parameters:

RandomForestRegressor(n\_estimators=200,random\_state=123)

## Model Metrics:

$R^2$  for test data Random Forest is 0.98

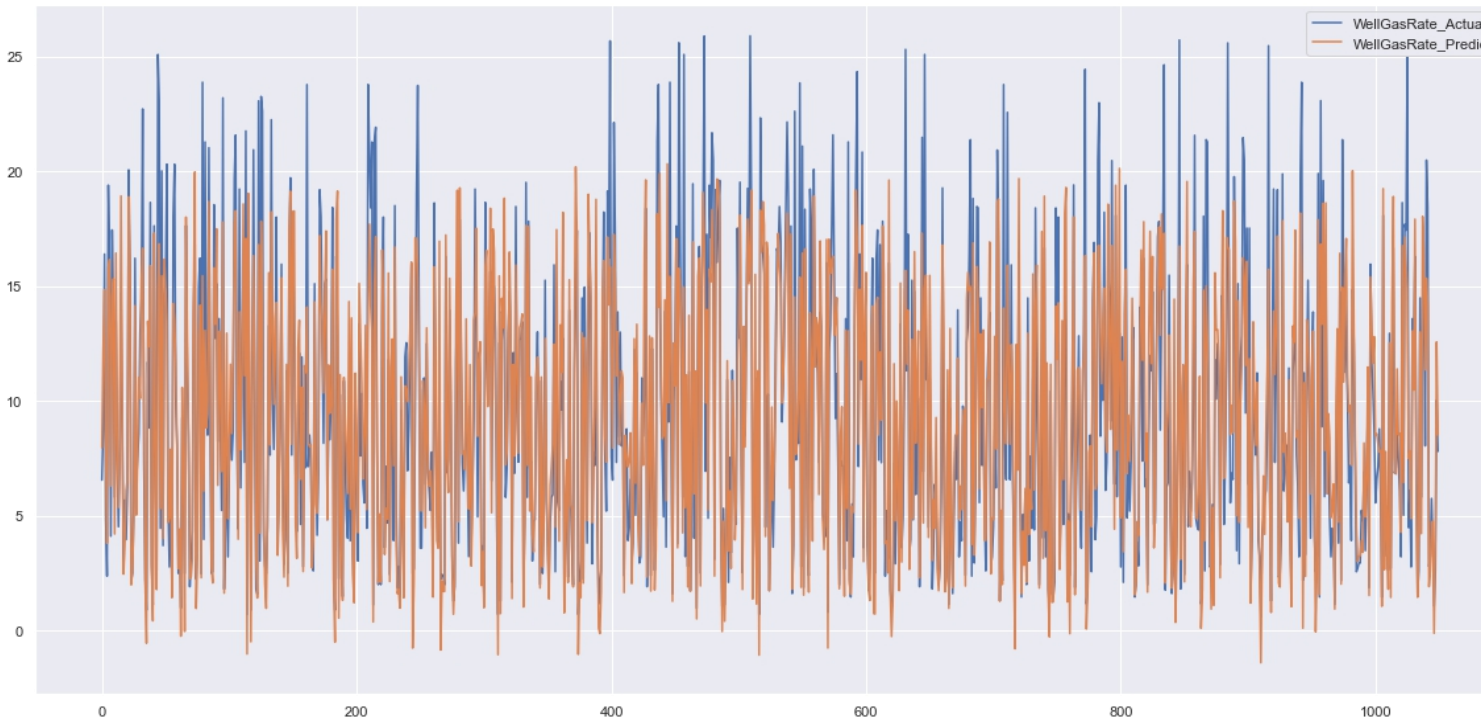
Mean Squared Error for test data Random Forest is 3199.69



Scatter Plot for Predicted vs Actual Oil Rate

## Gas rate

- It is essential to monitor the Oil and Gas rate in the multiphase flow, to estimate the pressure drop along the borewells.
- Linear regression and random forest regressor were used to map the target parameter, Oil rate.
- Appropriate action needs to be taken if any unusual behavior is observed in gas rate.



Predicted vs Actual Gas Rate

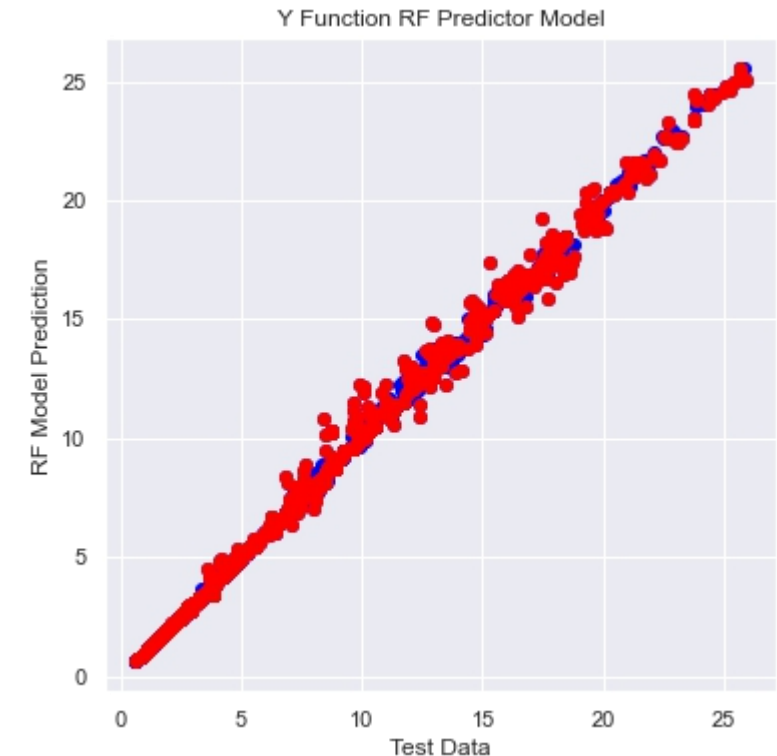
## Model Parameters:

RandomForestRegressor(n\_estimators=150,random\_state=123)

## Model Metrics:

$R^2$  for test data Random Forest is 0.95

Mean Squared Error for test data Random Forest is 0.1903



Scatter Plot for Predicted vs Actual Oil Rate