

Crude Oil Price Prediction

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CHAPTER-1

INTRODUCTION

1.1 Project Overview

Oil demand is inelastic, therefore the rise in price is good news for producers because they will see an increase in their revenue. Oil importers, however, will experience increased costs of purchasing oil. Because oil is the largest traded commodity, the effects are quite significant. A rising oil price can even shift economic/political power from oil importers to oil exporters. The crude oil price movements are subject to diverse influencing factors.

This Guided Project mainly focuses on applying Neural Networks to predict the Crude Oil Price. This decision helps us to buy crude oil at the proper time. Time series analysis is the best option for this kind of prediction because we are using the Previous history of crude oil prices to predict future crude oil. So we would be implementing RNN(Recurrent Neural Network) with LSTM(Long Short Term Memory) to achieve the task.

Crude oil price fluctuations have a far reaching impact on global economies and thus price forecasting can assist in minimising the risks associated with volatility in oil prices. Price forecasts are very important to various stakeholders: governments, public and private enterprises, policymakers, and investors

1.2 Purpose

Crude oil is amongst the most important resources in today's world, it is the chief fuel and its cost has a direct effect on the global habitat, our economy and oil exploration, exploitation and other activities. Prediction of oil prices has become the need of the hour, it is a boon to many large and small industries, individuals, the government.

The evaporative nature of crude oil, its price prediction becomes extremely difficult and it is hard to be precise with the same. Several different factors that affect crude oil prices. We propose a contemporary and innovative method of predicting crude oil prices using the artificial neural network (ANN).

The main advantage of this approach of ANN is that it continuously captures the unstable pattern of the crude oil prices which have been incorporated by finding out the optimal lag and number of the delay effect that controls the prices of crude oil.

Variation of lag in a period of time has been done for the most optimum and close results, we then have validated our results by evaluating the root mean square error and the results obtained using the proposed model have significantly outperformed.

CHAPTER-2

LITERATURE SURVEY

1	Paper title	Crude Oil Price Prediction Using Deep Learning
	Problem definition	Predict the crude oil prices and evaluate the model
	Methodology/ Algorithm	Using LSTM(Long Short based on deep learning
	Advantages	<ul style="list-style-type: none"> • The model is assessed by utilizing the valuable information in the WTI unrefined petroleum markets • The model achieves increments in the expected precision of results
	Disadvantages	The crude oil price depends on several external factors and high volatility
2	Paper title	Multi-step-ahead Crude Oil Price Forecasting Based on Autoregressive Integrated Moving Average and Improved Optimization enhanced Gated Recurrent Unit
	Problem definition	Crude oil price volatility has a strong influence on the stability of the global energy market. Therefore, both traders and policy makers have been interested in the accurate forecast of crude oil price so as to prevent large losses and to stabilize the market
	Methodology/ Algorithm	Using ARMA, IPSO, GRU
	Advantages	<ul style="list-style-type: none"> • To prevent large losses and to stabilize the market • Crude oil spot prices covering a period of 714 days • For twenty-step forecasting, the overall reduction of RMSE is as much as 53%, which significantly raises the prediction accuracy.
	Disadvantages	In the overall reduction of RMSE is not an

		100%, only 53% prediction accuracy was raises for 20th step forecasting
3	Paper title	A Novel Hybrid Approach with A Decomposition Method and The RVFL Model for Crude Oil Price Prediction
	Problem definition	Volatility of international crude oil prices is influenced by various external factors on different time scales. User search data (USD) which reflects investor attentions has been widely researched and proved to be associated with crude oil price change at different frequency bands.
	Methodology/ Algorithm	Random vector functional link (RVFL) ,Bivariate empirical mode decomposition (BEMD)
	Advantages	<ul style="list-style-type: none"> • Third, Brent crude oil spot price is used to test the proposed approach empirically • Forecasting results are analyzed with various evaluation criteria and verified robustness.
	Disadvantages	The proposed approach statistically outperforms traditional forecasting machine learning techniques and similar counterparts (with USD or EMD-based method) in terms of prediction accuracy.
4	Paper title	Forecasting Crude Oil Price Using Event Extraction
	Problem definition	Econometric Variable Prediction Problem
	Methodology/ Algorithm	Event Extraction Algorithm
	Advantages	<ul style="list-style-type: none"> • It uses textual contents and relation between entities • High quality features
	Disadvantages	Crude oil prices are largely influenced by various factors, such as economic

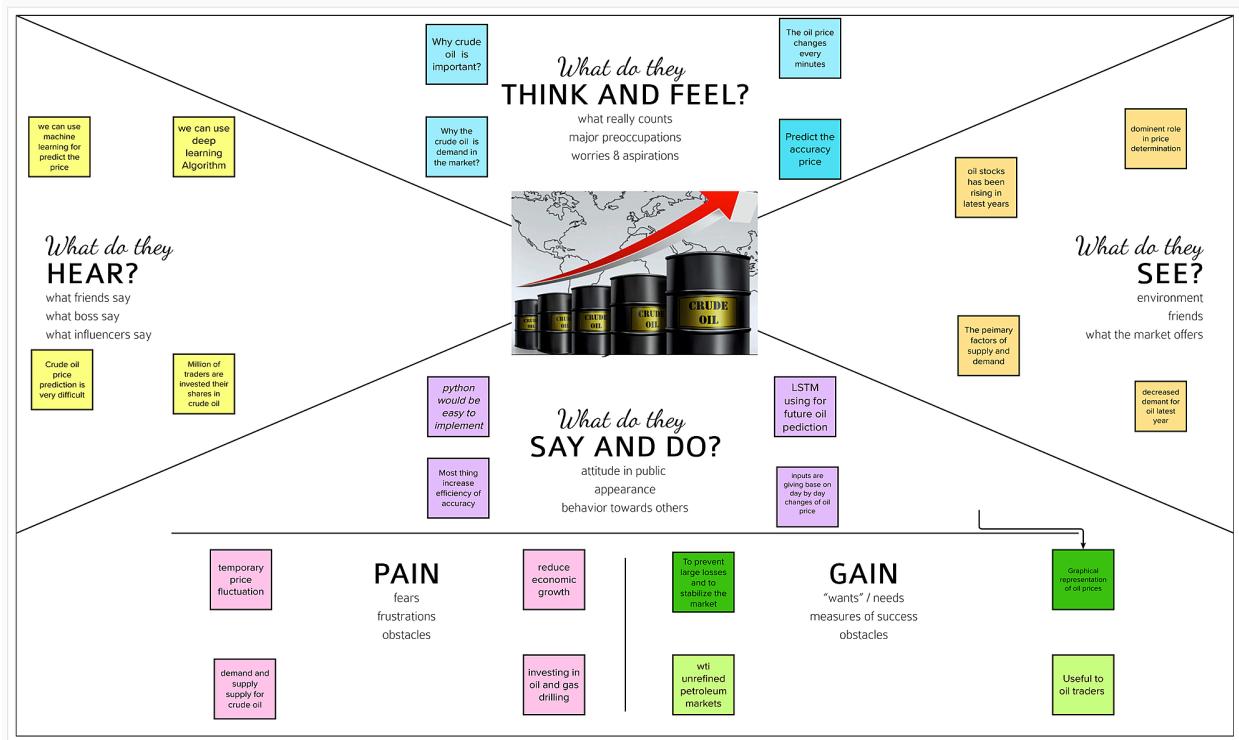
		development, financial markets, conflicts, wars, and political events.
5	Paper title	Predictive Analytics for Crude Oil Price Using RNN-LSTM Neural Network
	Problem definition	This study aims to certify the capability of a prediction model built based on the RNN-LSTM network to predict the future price of crude oil.
	Methodology/ Algorithm	Using Recurrent Neural Network and Long Short Term Network
	Advantages	<ul style="list-style-type: none"> • The capability of the network to provide an improvement of the accuracy of crude oil price prediction • Millions of traders investing the crude oil prediction
	Disadvantages	<ul style="list-style-type: none"> • It dynamic nature • It complex to predict the price of crude oil

CHAPTER-3

IDEATION & PROPOSED SOLUTION

3.1 Empathy Map Canvas

An empathy map is a simple, easy-to-digest visual that captures knowledge about a user's behaviours and attitudes. It is a useful tool to help teams better understand their users. Creating an effective solution requires understanding the true problem and the person who is experiencing it. The exercise of creating the map helps participants consider things from the user's perspective along with his or her goals and challenges.




3.2 Ideation & Brainstorming

Brainstorming provides a free and open environment that encourages

everyone within a team to participate in the creative thinking process that leads to problem solving. Prioritizing volume over value, out-of-the-box ideas are welcome and built upon, and all participants are encouraged to collaborate, helping each other develop a rich amount of creative solutions.

Step-1: Team Gathering, Collaboration and Select the Problem Statement

Template



Brainstorm & idea prioritization

Use this template in your own brainstorming sessions so your team can unleash their imagination and start shaping concepts even if you're not sitting in the same room.

⌚ 10 minutes to prepare
🕒 1 hour to collaborate
👥 2-8 people recommended

[Share template feedback](#)

Before you collaborate

A little bit of preparation goes a long way with this session. Here's what you need to do to get going.

⌚ 10 minutes

A Team gathering
Define who should participate in the session and send an invite. Share relevant information or pre-work ahead.

B Set the goal
Think about the problem you'll be focusing on solving in the brainstorming session.

C Learn how to use the facilitation tools
Use the Facilitation Superpowers to run a happy and productive session.

[Open article](#) →

1 Define your problem statement

What problem are you trying to solve? Frame your problem as a How Might We statement. This will be the focus of your brainstorm.


⌚ 5 minutes

PROBLEM

How might we [your problem statement]?

Key rules of brainstorming
To run a smooth and productive session

➡ Stay in topic.	💡 Encourage wild ideas.
⏸ Defer judgment.	👂 Listen to others.
🗣 Go for volume.	👁 If possible, be visual.



Need some inspiration?
Get a finished version of this template to kickstart your work.

[Open example](#) →

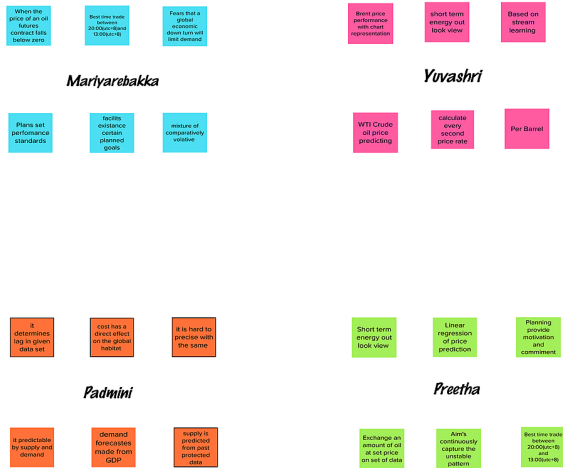
Step-2: Brainstorm, Idea Listing and Grouping

2

Brainstorm

Write down any ideas that come to mind that address your problem statement.

⌚ 10 minutes

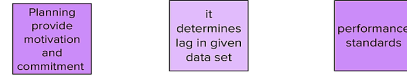
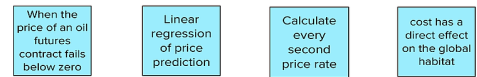


3

Group ideas

Take turns sharing your ideas while clustering similar or related notes as you go. Once all sticky notes have been grouped, give each cluster a sentence-like label. If a cluster is bigger than six sticky notes, try and see if you and break it up into smaller sub-groups.

⌚ 20 minutes

planning**Algorithm****Prediction****Calculation**

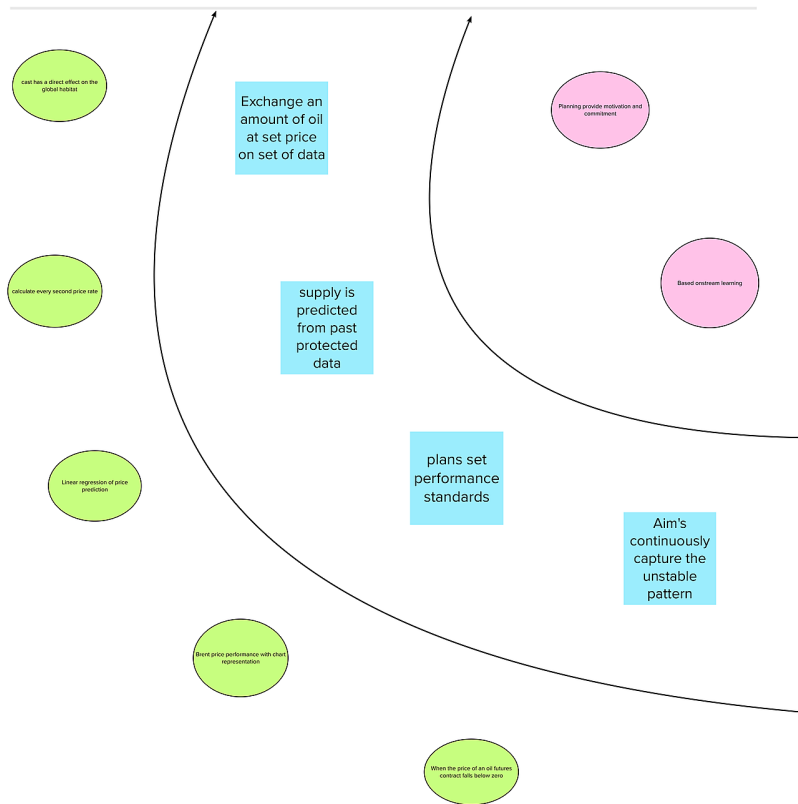
Step-3: Idea Prioritization

4

Prioritize

Your team should all be on the same page about what's important moving forward. Place your ideas on this grid to determine which ideas are important and which are feasible.

20 minutes



→

After you collaborate

You can export the mural as an image or pdf to share with members of your company who might find it helpful.

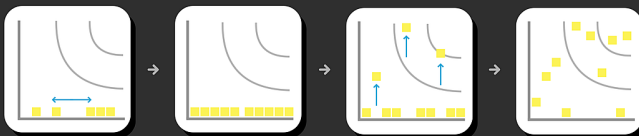
Quick add-ons

- A Share the mural**
Share a view link to the mural with stakeholders to keep them in the loop about the outcomes of the session.
- B Export the mural**
Export a copy of the mural as a PNG or PDF to attach to emails, include in slides, or save in your drive.

Keep moving forward

- Strategy blueprint**
Define the components of a new idea or strategy.
[Open the template →](#)
- Customer experience journey map**
Understand customer needs, motivations, and obstacles for an experience.
[Open the template →](#)
- Strengths, weaknesses, opportunities & threats**
Identify strengths, weaknesses, opportunities, and threats (SWOT) to develop a plan.
[Open the template →](#)

[Share template feedback](#)



3.3 Proposed Solution

S.No	Parameter	Description
1	Problem Statement (Problem to be solved)	Oil price increases are generally thought to increase inflation and reduce economic growth. Oil prices directly affect the prices of goods made with petroleum products. As mentioned above oil prices indirectly affect costs such as transportation, manufacturing, and heating.
2	Idea / Solution description	Crude oil is a raw natural resource that is extracted from the earth and refined into products such as gasoline and petroleum products. Crude oil is a global trade in markets around the world.
3	Novelty / Uniqueness	Supply, demand, and sentiment towards oil futures contracts, which are traded heavily by speculators play a dominant role in price determination.
4	Social Impact / Customer Satisfaction	Oil spills can damage the environment and the wildlife and marine life that depends on it they can also cause physical, mental, and financial stress to people as individuals.
5	Business Model (Revenue Model)	Models general includes information like products or services the business plans to sell, target markets, and any anticipated expenses. There are dozens of types of business models including retailers, manufacturers, fee-for-services, or freemium providers.
6	Scalability of the Solution	Crude oil prices are determined by global supply and demand. Economic growth is one of the biggest factors affecting

		retailers. The impact on crude oil prices can name some of them as the US economy, US dollar exchange, supply and demand statistics, and crude oil and petroleum distillates inventory.
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3.4 Problem Solution Fit

Crude Oil Price Prediction		Project Design Phase I Solution Fit		Team ID: PNT2022TMID38415	
Define CS, fit into CC	1. CUSTOMER SEGMENT(S) CS There are a lot of people and countries by whom oil is being used.	6. CUSTOMER CONSTRAINTS CC Low internet connectivity, Application server down and application debug.	5. AVAILABLE SOLUTIONS AS There were prediction systems before but not very accurate.	Explore AS, differentiate	
Focus on J&P, tap into C	2. JOBS-TO-BE-DONE / PROBLEMS J&P We predict the price of crude oil there by making our customers aware of the market trend.	9. PROBLEM ROOT CAUSE RC Crude oil price fluctuations have a great impact on global economy thus predicting crude oil price will help us taking minimal risks.	7. BEHAVIOUR BE Open the application and get to know the market trends.	Focus on J&P, tap into C	
Identify strong TR & EM	3. TRIGGERS TR When they want to know about the trends of prices.	10. YOUR SOLUTION SL This project mainly focuses on applying neural networks to predict the crude oil price. This decision helps us to buy crude oil at proper time.	8. CHANNELS of BEHAVIOUR CH See the prices and analyze the trends.	Extract online & offline CH of BE	
	4. EMOTIONS: BEFORE / AFTER EM They feel interested in knowing about how price of oil changes with demand and supply.		Wait for the response from the server side.		

Problem-Solution fit canvas is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 license
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CHAPTER-4

REQUIREMENT ANALYSIS

4.1 Functional Requirement

Following are the functional requirements of the proposed solution.

FR No.	Functional Requirement (Epic)	Sub Requirement (Story / Sub-Task)
FR-1	User Homepage	Registration through Form Registration through Gmail Registration through LinkedIN
FR-2	Prediction	The User can enter the required data and the predicted price of the crude oil will be displayed.
FR-3	Display	The predicted graph will be displayed in the user's screen.

4.2 Non-functional Requirements:

Following are the non-functional requirements of the proposed solution.

FR

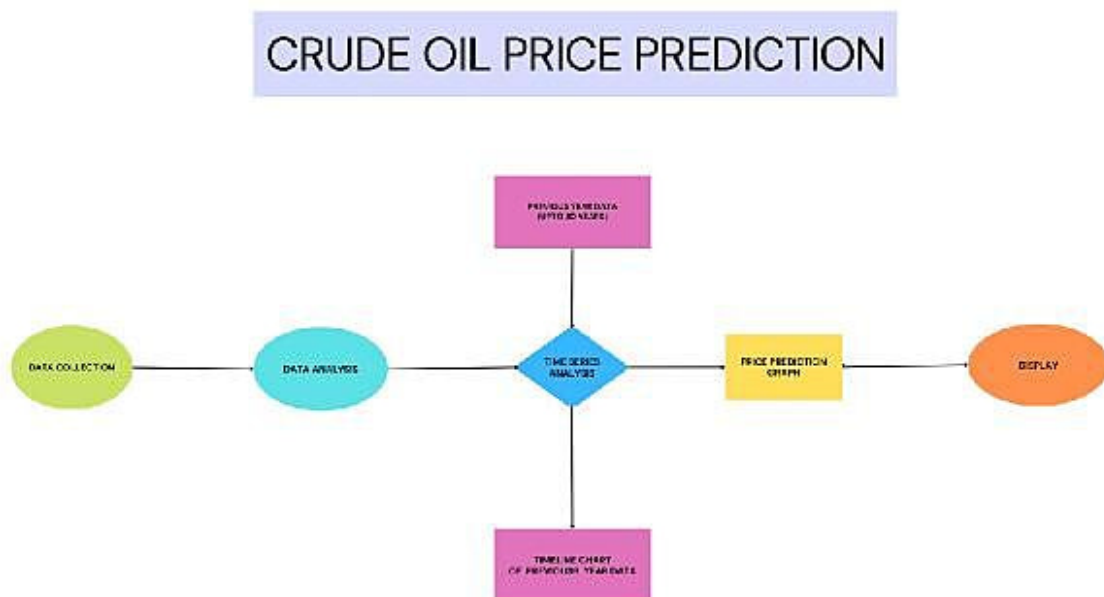
FR No.	Non-Functional Requirement	Description
NFR-1	Usability	The predictor is user friendly and easy to use it.
NFR-2	Security	The model is tested for its security before the deployment and it is highly secure.
NFR-3	Reliability	Highly reliable.
NFR-4	Performance	It is efficient and optimized method to predict the crude oil price.
NFR-5	Availability	Accessible at any time.
NFR-6	Scalability	It will perform well for many number of users with the same speed.

CHAPTER-5

PROJECT DESIGN

5.1 Data Flow Diagram

A Data Flow Diagram (DFD) is a traditional visual representation of the information flows within a system. A neat and clear DFD can depict the right amount of the system requirement graphically. It shows how data enters and leaves the system, what changes the information, and where data is stored.



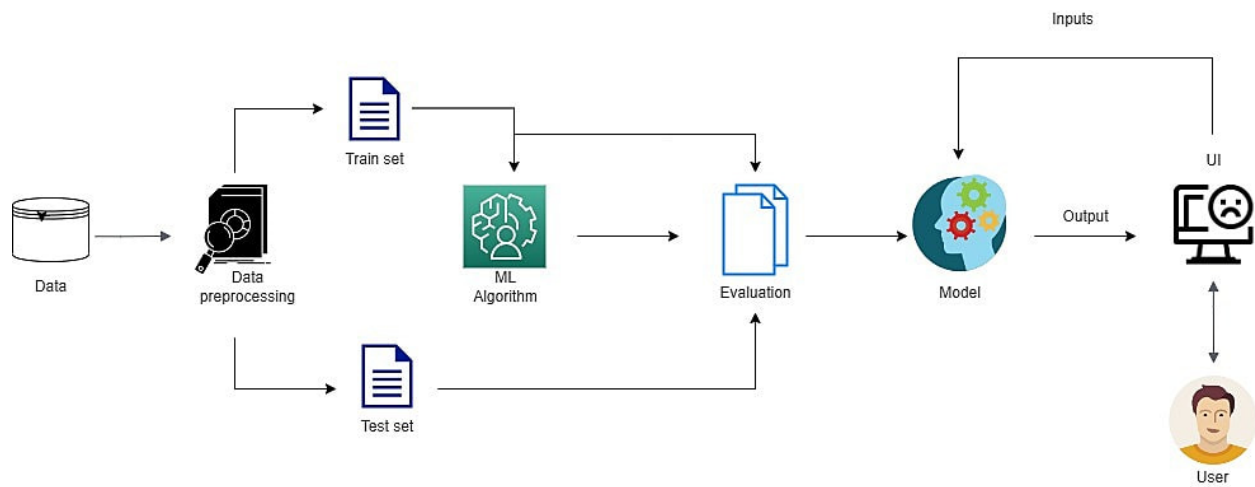
5.2 User Stories

User Type	Functional Requirement (Epic)	User Story Number	User Story / Task	Acceptance criteria	Priority	Release
Customer (Mobile user)		USN-1	As a user, I can see the crude oil price history.	I can access the data available.	High	Sprint-1
		USN-2	By Entering the year(date) the model will analyse and display the output.	The analysed result will be displayed in the screen.	High	Sprint-2

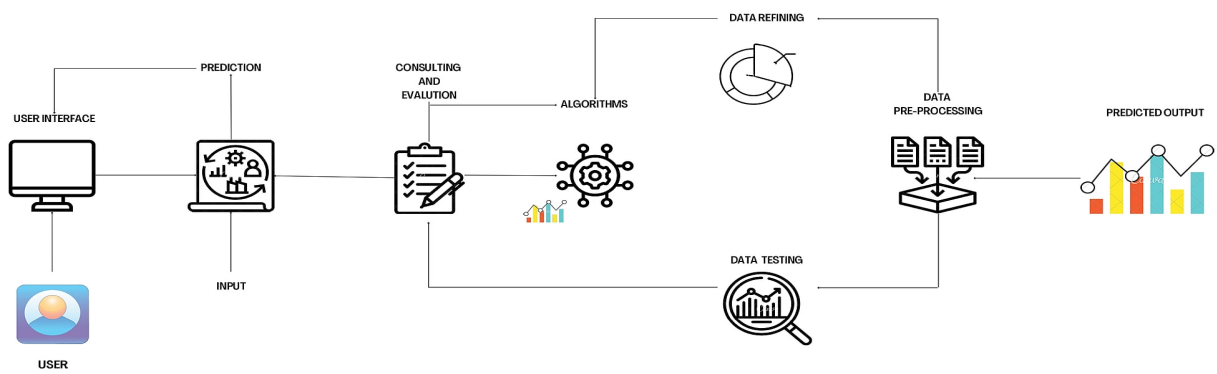
5.3 Solution & Technical Architecture

A Solution architecture (SA) is an architectural description of a specific solution. SAs combine guidance from different enterprise architecture viewpoints (business, information and technical), as well as from the enterprise solution architecture (ESA). Ultimately, solution architecture is aimed at the following overarching goals:

- (i) Streamlining of day-to-day activities
- (ii) Providing a more efficient production environment
- (iii) Lowering costs and gaining cost-effectiveness
- (iv) Providing a secure, stable, and supportable environment



SOLUTION ARCHITECTURE



TECHNICAL ARCHITECTURE

CHAPTER-6

PROJECT PLANNING & SCHEDULING

6.1 Sprint Planning & Estimation

TITLE	DESCRIPTION	DATE
Literature Survey & Information Gathering	Literature survey on the selected project & gathering information by referring the, technical papers, research publications etc.	28 SEPTEMBER 2022
Prepare Empathy Map	Prepare Empathy Map Canvas to capture the user Pains & Gains, Prepare list of problem statements	24 SEPTEMBER 2022
Ideation	List the by organizing the brainstorming session and prioritize the top 3 ideas based on the feasibility & importance.	25 SEPTEMBER 2022
Proposed Solution	Prepare the proposed solution document, which includes the novelty, feasibility of idea, business model, social impact, scalability of solution, etc.	23 SEPTEMBER 2022
Problem Solution Fit	Prepare problem - solution fit document.	30 SEPTEMBER 2022
Solution Architecture	Prepare solution architecture document.	28 SEPTEMBER 2022

Customer Journey	Prepare the customer journey maps to understand the user interactions & experiences with the application (entry to exit).	20 OCTOBER 2022
Functional Requirement	Prepare the functional requirement document.	8 OCTOBER 2022
Data Flow Diagrams	Draw the data flow diagrams and submit for review.	9 OCTOBER 2022
Technology Architecture	Prepare the technology architecture diagram.	10 OCTOBER 2022
Prepare Milestone & Activity List	Prepare the milestones & activity list of the project.	05 November 2022
Project Development - Delivery of Sprint-1, 2, 3 & 4	Develop & submit the developed code by testing it.	IN PROGRESS...

6.2 Sprint Delivery Schedule

Use the below template to create product backlog and sprint schedule

Sprint	FunctionalRequirement(Epic)	UserStoryNumber	UserStory/Task	StoryPoints	Priority	TeamMembers
Sprint-1	DataCollection	USN-1	DownloadCrudeOilPriceDataset	2	Medium	S.Mariyarebakka
Sprint-1	DataPreprocessing	USN-2	ImportingTheDatasetintoWorkspace	1	Low	S.Mariyarebakka
Sprint-1		USN-3	HandlingMissingData	3	Medium	S.Mariyarebakka
Sprint-1		USN-4	FeatureScaling	3	Low	S.Mariyarebakka
Sprint-1		USN-5	DataVisualization	3	Medium	S.Mariyarebakka
Sprint-1		USN-6	SplittingDataintoTrain andTest	4	High	S.Mariyarebakka
Sprint-1		USN-7	CreatingADatasetwith SlidingWindows	4	High	S.Mariyarebakka
Sprint-2	ModelBuilding	USN-8	ImportingTheModelBuildingLibraries	1	Medium	S.Mariyarebakka A.Yuvashri
Sprint-2		USN-9	InitializingTheModel	1	Medium	S.Mariyarebakka R.Padmini
Sprint-2		USN-10	AddingLSTMLayers	2	High	S.Mariyarebakka M. Preetha
Sprint-2		USN-11	AddingOutputLayers	3	Medium	S.Mariyarebakka A.Yuvashri
Sprint-2		USN-12	ConfigureTheLearningProcess	4	High	S.Mariyarebakka R.Padmini

Sprint	FunctionalRequirement(Epic)	UserStoryNumber	UserStory/Task	StoryPoints	Priority	TeamMembers
Sprint-2		USN-13	TrainTheModel	2	Medium	S.Mariyarebakka R.Padmini
Sprint-2		USN-14	ModelEvaluation	1	Medium	S.Mariyarebakka A.Yuvashri
Sprint-2		USN-15	SaveTheModel	2	Medium	S.Mariyarebakka A.Yuvashri
Sprint-2		USN-16	TestTheModel	3	High	S.Mariyarebakka A.Yuvashri
Sprint-3	ApplicationBuilding	USN-17	CreateAnHTMLFile	4	Medium	S.Mariyarebakka A.Yuvashri
Sprint-3		USN-18	BuildPythonCode	4	High	S.Mariyarebakka A.Yuvashri R.Padmini M.Preetha
Sprint-3		USN-19	RunTheAppinLocalBrowser	4	Medium	S.Mariyarebakka A.Yuvashri
Sprint-3		USN-20	ShowcasingPredictionOn UI	4	High	S.Mariyarebakka
Sprint-4	TrainTheModelOnIBM	USN-21	RegisterForIBMCloud	4	Medium	S.Mariyarebakka A.Yuvashri R.Padmini M.Preetha
Sprint-4		USN-22	TrainTheMLModelOnIBM	8	High	S.Mariyarebakka A.Yuvashri R.Padmini
Sprint-4		USN-23	IntegrateFlaskwithScoringEndPoint	8	High	S.Mariyarebakka A.Yuvashri R.Padmini M.Preetha

Sprint	TotalStoryPoints	Duration	SprintStartDate	SprintEndDate(Planned)	StoryPointsCompleted (as onPlannedEndDate)	SprintReleaseDate(Actual)
Sprint-1	20	6Days	29Oct2022	03Nov2022	20	05Nov2022
Sprint-2	20	6Days	30Oct2022	05Nov2022	20	08Nov2022
Sprint-3	20	6Days	06Nov2022	12Nov2022	20	12Nov2022
Sprint-4	20	6Days	14Nov2022	19Nov2022	20	18Nov2022

Velocity:

Imagine we have a 10-day sprint duration, and the velocity of the team is 20 (points per sprint).

Let's calculate the team's average velocity (AV) per iteration unit (story points per day)

$$AV = \frac{\text{sprint duration}}{\text{velocity}} = \frac{20}{10} = 2$$



Burndown Chart:

A burn down chart is a graphical representation of work left to do versus time. It is often used in agile software development methodologies such as Scrum. However, burndown charts can be applied to any project containing measurable progress over time.



CHAPTER-7

CODING & SOLUTIONING

7.1 Feature 1

```
In [1]:
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt

In [2]:
Data=pd.read_excel(r"/content/Crude Oil Prices Daily.xlsx")
Data
Out[2]:
```

	Date	Closing Value
0	1986-01-02	25.56
1	1986-01-03	26.00
2	1986-01-06	26.53
3	1986-01-07	25.85
4	1986-01-08	25.87
...
8218	2018-07-03	74.19
8219	2018-07-04	NaN
8220	2018-07-05	73.05
8221	2018-07-06	73.78
8222	2018-07-09	73.93

8223 rows x 2 columns

```
In [3]:
Data.isnull().any()
Out[3]:
Date          False
Closing Value    True
dtype: bool

In [4]:
```

In [4]:

```
Data.isnull().sum()
```

Out[4]:

```
Date          0
Closing Value  7
dtype: int64
```

In [5]:

```
Data.dropna(axis=0,inplace=True)
Data.isnull().sum()
```

Out[5]:

```
Date          0
Closing Value  0
dtype: int64
```

In [6]:

```
Data_oil=Data.reset_index()['Closing Value']
```

In [7]:

```
Data_oil
```

Out[7]:

```
0      25.56
1      26.00
2      26.53
3      25.85
4      25.87
...
8211   73.89
8212   74.19
8213   73.05
8214   73.78
8215   73.93
```

Name: Closing Value, Length: 8216, dtype: float64

In [8]:

```
from sklearn.preprocessing import MinMaxScaler
scaler= MinMaxScaler(feature_range=(0,1))
Data_oil=scaler.fit_transform(np.array(Data_oil).reshape(-1,1))
```

CHAPTER-9

RESULTS

9.1 Performance Metrics

Input

Input measures monitor the amount of resources being used to develop, maintain, or deliver a product, activity or service. Examples include:

- Money spent on equipment
- Number of employee hours worked
- Number of vehicles
- Facility costs
- Total operating expenditures
- Rental fees
- Number of full-time employees

Output

Output measures monitor “how much” was produced or provided. They provide a number indicating how many items, referrals, actions, products, etc. were involved. Examples include:

- Number of permits issued
- Number of pavement miles resurfaced
- Number of people trained
- Number of water leaks fixed
- Number of cases managed
- Number of arrests made
- Number of documents processed
- Number of clients served

Efficiency

Efficiency measures are used to monitor the relationship between the amount produced and the resources used. This means that efficiency measures are created by comparing input and output, see . There are two

general types of efficiency measures: unit cost and productivity.

Unit cost is a comparison of an input to an output (i.e. resources used/number produced).

Productivity is a comparison of an output to an input (i.e. number produced/resources used). Examples include:

Unit Cost

- Cost per license issued
- Cost per employee taught
- Cost per lane-mile paved
- Cost per client served
- Cost per document

Productivity

- Licenses processed per employee-hour
- Units produced per week
- Students taught per instructor
- Cases resolved per agent
- Calls handled per hour

Quality

Quality measures are used to determine whether customer expectations are being met. These expectations can take many forms, including: timeliness, accuracy, meeting regulatory requirements, courtesy, and meeting customer needs.

The expectations can be identified as a result of internal or external feedback.

The comparison of outputs is often used to create measures of quality. It may be important to identify certain aspects (aspects / total outputs) about the services, products or activities produced by an organization that are important to its customers.

This comparison of specific outputs to total outputs is used to create measures of accuracy, timeliness and to determine the extent regulatory requirements are met.

Quality measures can also be derived from the evaluation of customer feedback data.

Timeliness

- Busy signal rate
- Percent of drivers licenses issued within one hour.

Accuracy

- Percent of applications requiring rework due to internal errors.
- Taxpayer error rate on tax returns.

Requirements

- Percent of wells meeting minimum water quality requirements.
- Percentage of clients that rated themselves as successfully rehabilitated.

CHAPTER-10

ADVANTAGES & DISADVANTAGES

ADVANTAGES:

Crude oil generates heat. Heating this material and other petroleum products can warm homes in colder weather, making modern living possible even in colder climates. This oil also produces energy.

This product makes machinery move by providing the lubrication oil that modern industrial equipment depends on to run smoothly.

Crude is also used to create the asphalt that cars and trucks move on.

Asphalt is easier to lay than concrete and is generally cheaper as a result.

Crude is also an integral part of modern textile production, with 40 percent of textiles now containing some petroleum by product.

DISADVANTAGES:

- Oil is a non-renewable source of energy.
- Burning oil produces carbon dioxide gas.
- Burning oil can pollute the air.

- Much of our oil has to be imported and it is becoming more and more expensive as reserves reduce and imports increase.

CHAPTER-11

CONCLUSION

- Crude oil prices are highly fluctuated time series. It is affected by many economic and political factors. Specially, there are several sudden increase and decrease throughout the time.
- In order to eliminate the irregular trend. We try several methods, hpfilter, loess filter, log transformation and difference.
- Thus, only analysis of the crude oil price itself can hardly predict the sudden change. Maybe, we can find some latent variable to improve modeling and prediction.
- Introduce the variable selection before forecasting. In this process, we compare three different methods and analyze core influencing factors based on the literature review from supply and demand, global economic development, financial market, and technology aspects.

CHAPTER-12

FUTURE SCOPE

It shows that the prediction accuracy of the variable selection-machine learning integrated model is significantly improved compared with that of the univariate model.

we may introduce more independent variables with the help of internet search data, test our framework performance.

Moreover, investor sentiment can be quantified in this process. In addition, different variable selection methods can be introduced more.

This indicates that the variable selection-based machine learning integrated research framework proposed in this significantly improves the forecasting performance of oil prices

CHAPTER-13

APPENDIX

SOURCE CODE:

APP.PY

```
import numpy as np

from flask import Flask, render_template, request
from tensorflow.keras.models import load_model

app = Flask(__name__, template_folder='template')

model = load_model("./model/crude_oil.h5")

@app.route('/')
```

```

def home():
    return render_template('index.html')

@app.route('/predict')
def home2():
    return render_template('predict.html')

@app.route("/login", methods=['POST', 'GET'])
def Login():
    if request.method == 'POST':
        a = request.form['year1']
        b = request.form['year2']
        c = request.form['year3']
        d = request.form['year4']
        e = request.form['year5']
        f = request.form['year6']
        g = request.form['year7']
        h = request.form['year8']
        i = request.form['year9']
        j = request.form['year10']

        x_input = [a, b, c, d, e, f, g, h, i, j]
        for i in range(0, len(x_input)):
            x_input[i] = float(x_input[i])
        print(x_input)

        x_input = np.array(x_input).reshape(1, -1)
        temp_input = list(x_input)
        temp_input = temp_input[0].tolist()
        lst_output = []
        n_steps = 10
        i = 0
        while (i < 1):

            if (len(temp_input) > 10):
                x_input = np.array(temp_input[1:])
                print("{} day input {}".format(i, x_input))
                x_input = x_input.reshape(1, -1)
                x_input = x_input.reshape((1, n_steps, 1))
                yhat = model.predict(x_input, verbose=0)
                print("{} day output {}".format(i, yhat))
                temp_input.extend(yhat[0].tolist())
                temp_input = temp_input[1:]
                lst_output.extend(yhat.tolist())
                i = i + 1
            else:

```

```

        x_input = x_input.reshape((1, n_steps, 1))
        yhat = model.predict(x_input, verbose=0)
        print(yhat[0])
        temp_input.extend(yhat[0].tolist())
        print(len(temp_input))
        lst_output.extend(yhat.tolist())
        i = i + 1

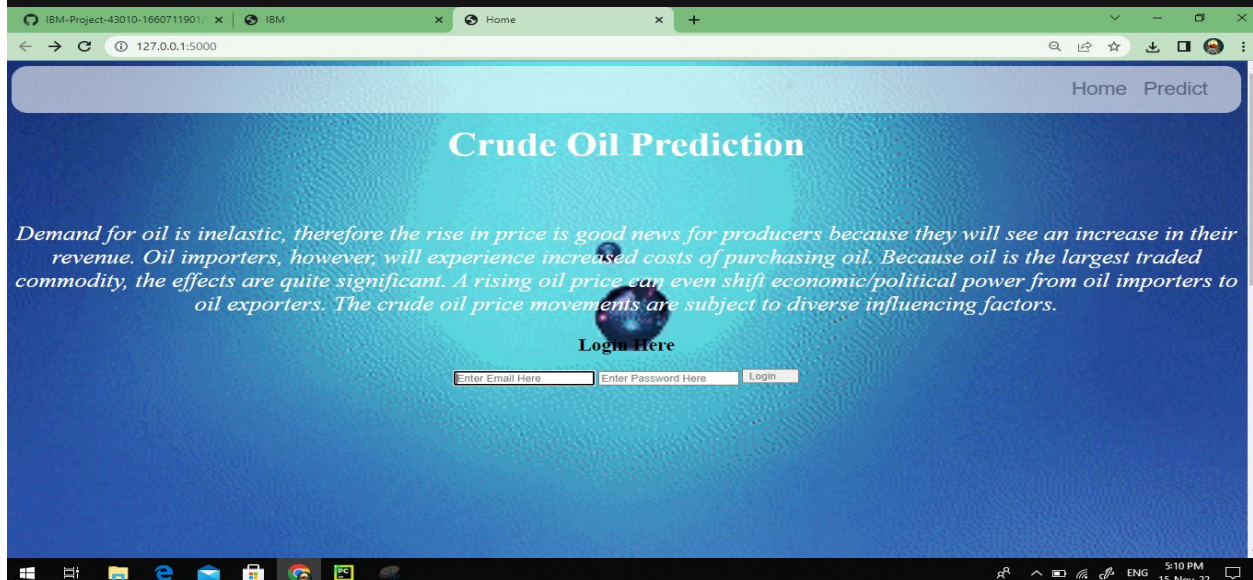
    print(lst_output)

    return render_template("predict.html", showcase='The next day predicted
value is:' + str(lst_output))

if __name__ == '__main__':

    app.run(debug=True, port=5000)

```



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127.0.0.1:5000/predict

127.0.0.1:5000/predict

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Predict Home

Crude Oil Prediction

Enter previous 10th day price

Enter previous 9th day price

Enter previous 8th day price

Enter previous 7th day price

Enter previous 6th day price

Enter previous 5th day price

Enter previous 4th day price

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