

MLOPS MASTERS

Production Grade MLOps Application
Development Course

Data Scientist and Mentor with more than 5 years of working experience in the field of Python, Machine Learning, Deep Learning, MLOps, Generative AI, and Robotics systems. Hands-on experience on Classification, Regression, Clustering, Computer vision, Natural language processing, and Transfer learning models to solve challenging business problems.



BOKTIAR AHMED BAPPY

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 @dswithbappy

 entbappy

UNDERSTAND MLOPS WITH REAL WORLD ANALOGY

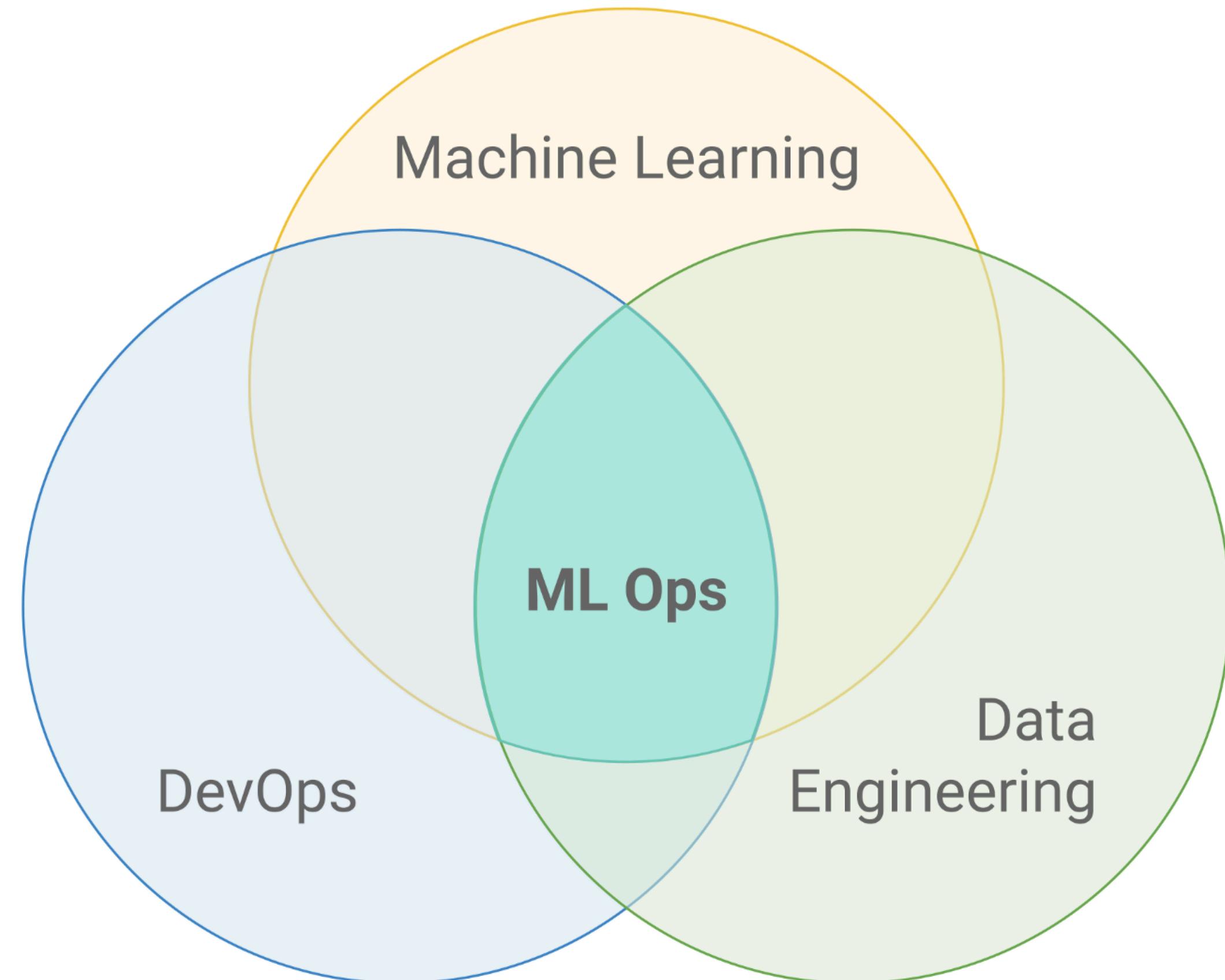


"MLOps is the practice of deploying machine learning models into production"

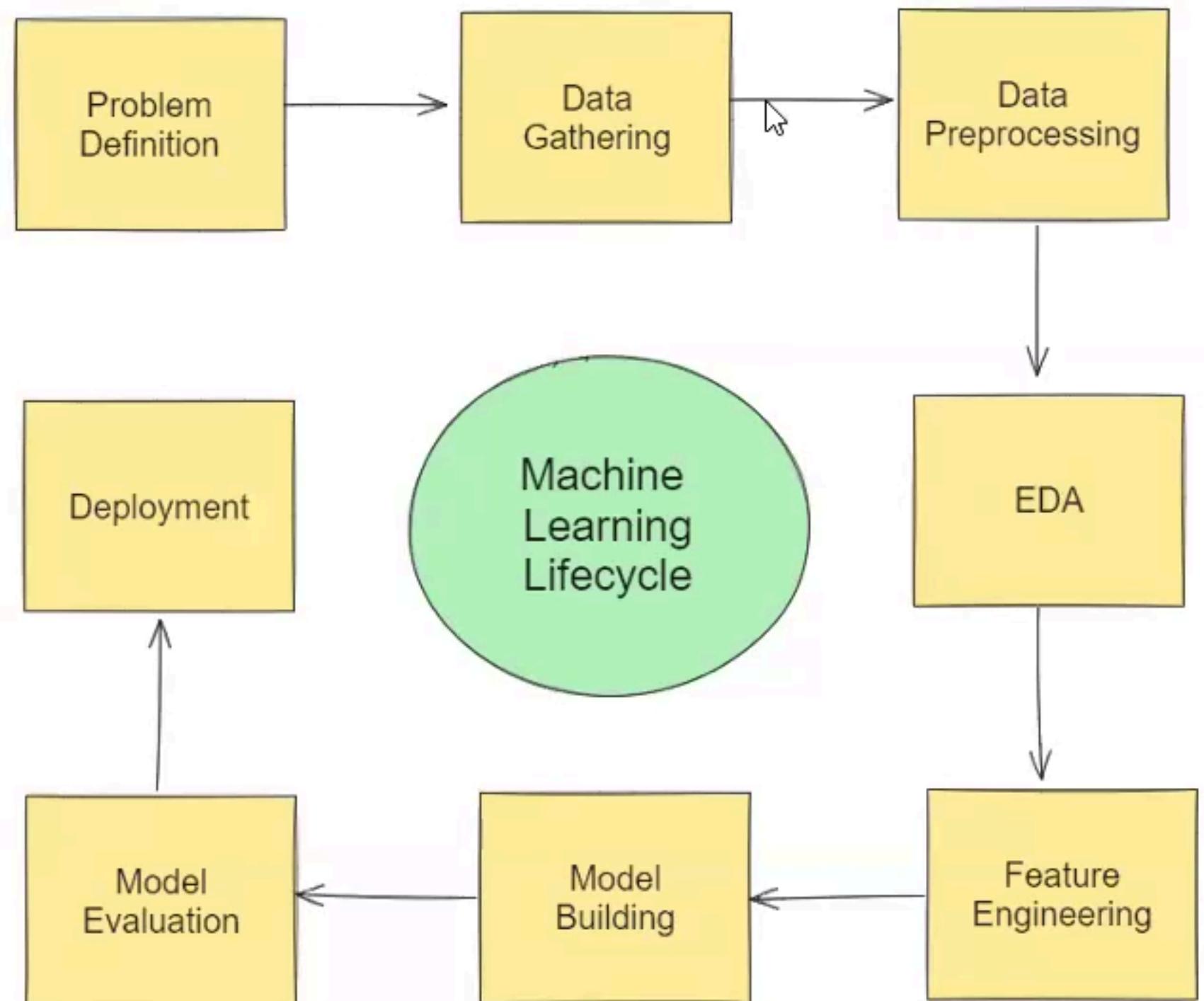


"MLOps refers to the practice and discipline within machine learning that aims to unify and streamline the machine learning system development (Dev) and machine learning system operation (Ops). It involves collaboration between data scientists, ML engineers, and IT professionals to automate and optimize the end-to-end lifecycle of machine learning applications."

MLOps



INTRODUCTION TO MLOPS & IMPORTANCE





Delhi Capitals •



Rajasthan Royals

RR chose to field.

Current RR: 6.54

(1.5/20 ov) 12/0

WIN PROBABILITY

● RR 54.04%

100%

[Live](#)[Scorecard](#)[Live Blog](#)[Commentary](#)[Live Stats](#)[Overs](#)[Playing XI](#)[Table](#)[Videos](#)[Photos](#)[News](#)[Fantasy](#)

Live Forecast: DC 173

BATTERS

	R	B	4s	6s	SR	This Bowler	Last 5 Balls	Mat	Runs	HS	Ave
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Abishek Porel* (lh)

5	4	1	0	125.00	5 (4b)	5 (4b)	26	501	73+	26.37
---	---	---	---	--------	--------	--------	----	-----	-----	-------

Jake Fraser-McGurk (rhb)

7	7	1	0	100.00	1 (1b)	1 (1b)	44	911	84	23.97
---	---	---	---	--------	--------	--------	----	-----	----	-------

BOWLERS

	O	M	R	W	Econ	Os	4s	6s	This spell	Mat	Wkts	BBI	Ave
--	---	---	---	---	------	----	----	----	------------	-----	------	-----	-----

Sandeep Sharma (rm)

0.5	0	6	0	7.20	2	1	0	0.5 - 0 - 6 - 0	183	201	5/18	25.11
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Trent Boult (lfm)

1	0	6	0	6.00	4	1	0	1 - 0 - 6 - 0	219	251	4/13	26.01
---	---	---	---	------	---	---	---	---------------	-----	-----	------	-------

Partnership: 12 Runs, 11 B (RR: 6.54)

Reviews Remaining: Delhi Capitals - 2 of 2, Rajasthan Royals - 2 of 2

RECORD

56

Sanju Samson has broken the record for playing most IPL matches (56) as captain for RR, going past Shane Warne

• 4 • 1 1 1st • 4 • • • 2 See all >

Live Blog - Delhi Capitals vs
Rajasthan Royals - Hetmyer,
Jurel out for Royals; Ishant
back for Capitals



Delhi Capitals host Rajasthan
Royals at Arun Jaitley stadium.
Get all your live stats, analyses
and colour right here on
ESPNcricinfo's live blog

Data Problem

ESPNcricinfo Live Scores Series Teams News Features Videos Stats IPL 2024 Edition IN ☾ 🔔 🏆 ⚡ Q

Delhi Capitals • (1.5/20 ov) **12/0**

Rajasthan Royals RR chose to field.

Current RR: 6.54 Live Forecast: DC 173

[Live](#) Scorecard Live Blog Commentary Live Stats Overs Playing XI Table Videos Photos News Fantasy

T20 CAREER													
BATTERS	R	B	4s	6s	SR	This Bowler		Last 5 Balls	Mat	Runs	HS	Ave	
Abishek Porel* (lhb)	5	4	1	0	125.00	5 (4b)		5 (4b)	26	501	73*	26.37	
Jake Fraser-McGurk (rhb)	7	7	1	0	100.00	1 (1b)		1 (1b)	44	911	84	23.97	
BOWLERS	O	M	R	W	Econ	Os	4s	6s	This spell	Mat	Wkts	BBI	Ave
Sandeep Sharma (rm)	0.5	0	6	0	7.20	2	1	0	0.5 - 0 - 6 - 0	183	201	5/18	25.11
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RECORD **56** Sanju Samson has broken the record for playing most IPL matches (56) as captain for RR, going past Shane Warne

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WIN PROBABILITY ● RR 54.04% 100%

DC RR DC Innings RR Innings 100%

Current Over 2 • DC 12/0

Live Forecast: DC 173

Powered by Smart Stats

MATCH COVERAGE All Match News >

Live Blog - Delhi Capitals vs Rajasthan Royals - Hetmyer, Jurel out for Royals; Ishant back for Capitals 

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Code Implementation Problem

```
# Import necessary libraries
from sklearn.datasets import load_iris
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import accuracy_score

# Load the Iris dataset
data = load_iris()
X = data.data
y = data.target

# Preprocess the data: Standardize features
scaler = StandardScaler()
X_scaled = scaler.fit_transform(X)

# Split the data into training and test sets
X_train, X_test, y_train, y_test = train_test_split(X_scaled, y, test_size=0.3, random_state=42)

# Train a logistic regression model
model = LogisticRegression()
model.fit(X_train, y_train)

# Make predictions on the test set
y_pred = model.predict(X_test)

# Evaluate the model
accuracy = accuracy_score(y_test, y_pred)
print(f"Accuracy: {accuracy:.2f}")
```

1. **Difficulty in Maintenance:** As the complexity of the code increases, it becomes harder to maintain. Changes in one part of the code can unexpectedly affect other parts due to the tightly coupled nature of the implementation. This can lead to increased time spent debugging and verifying that changes do not break existing functionality.
2. **Limited Reusability:** In a non-modular setup, code reusability is minimal. Functions and components are often written to solve a specific problem and are tightly integrated with other parts of the code, making them difficult to extract and reuse in other projects or contexts.
3. **Harder Collaboration:** When code is not modular, it's more challenging for multiple developers to work on the same project simultaneously. Since everything is interconnected, developers need to be more cautious about the changes they make, which can slow down development and increase the risk of merge conflicts.
4. **Poor Scalability:** Scaling a non-modular application can be problematic. As more features and functionalities are added, the codebase can become unwieldy and difficult to manage. This lack of scalability extends not only to the size of the codebase but also to the handling of larger data sets or more complex models.
5. **Testing Challenges:** Testing a non-modular codebase is typically more challenging and less effective. Without clear boundaries between

Code Implementation Problem

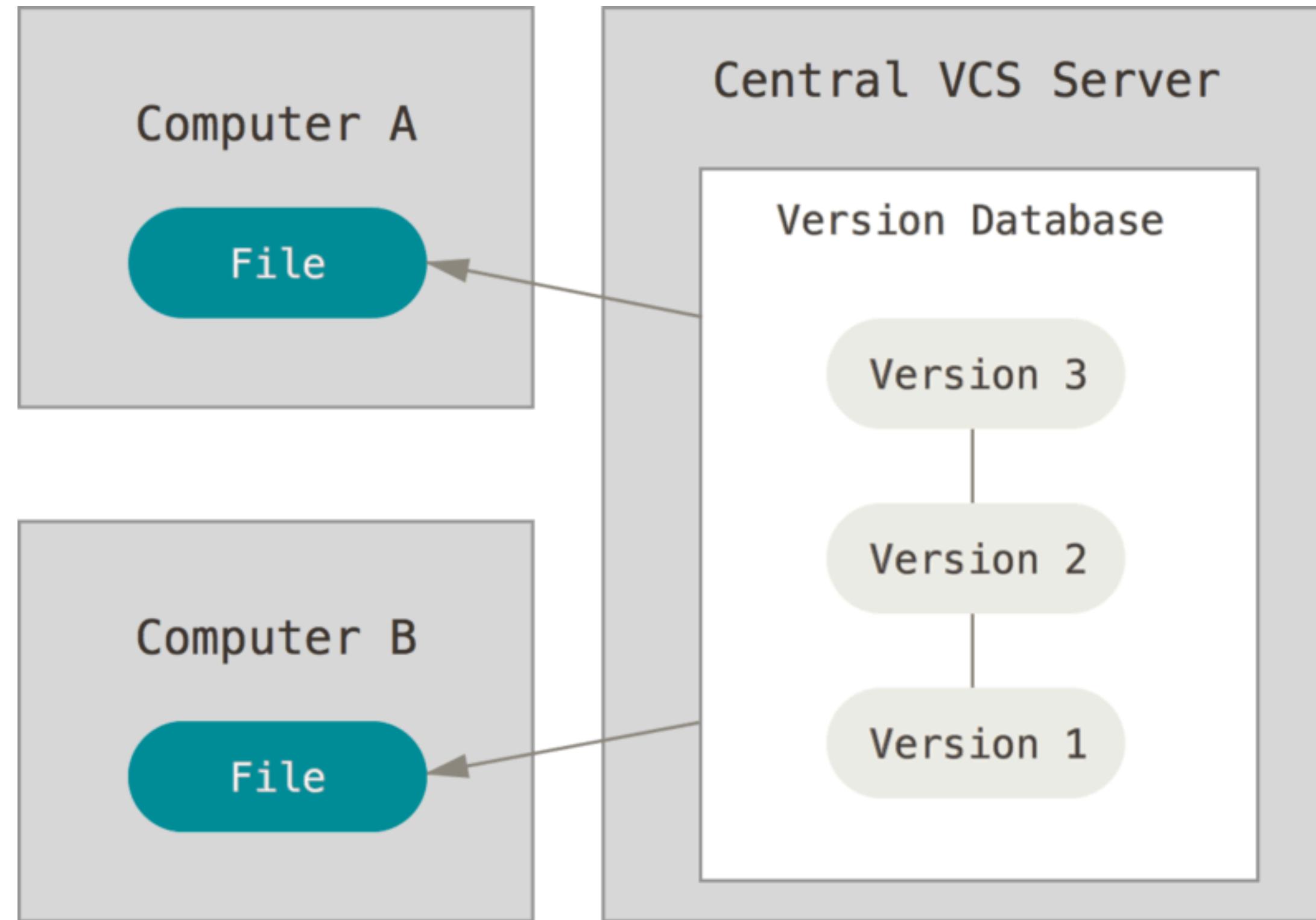
The screenshot shows a dark-themed interface of the Visual Studio Code (VS Code) code editor. The main area displays a Python script named `model_train.py`. The code defines a step function `train_model` that takes a `pd.DataFrame` argument and returns `None`. The function contains a docstring and an argument description for `df`. The `steps` folder in the Explorer sidebar contains three files: `clean_data.py`, `ingest_data.py`, and `model_train.py`.

```
1 import logging
2
3 import pandas as pd
4 from zenml import step
5
6
7 @step
8 def train_model(df: pd.DataFrame) -> None:
9     """
10         Trains the model on the ingested data.
11
12     Args:
13         df: the ingested data
14     """
15     pass
```

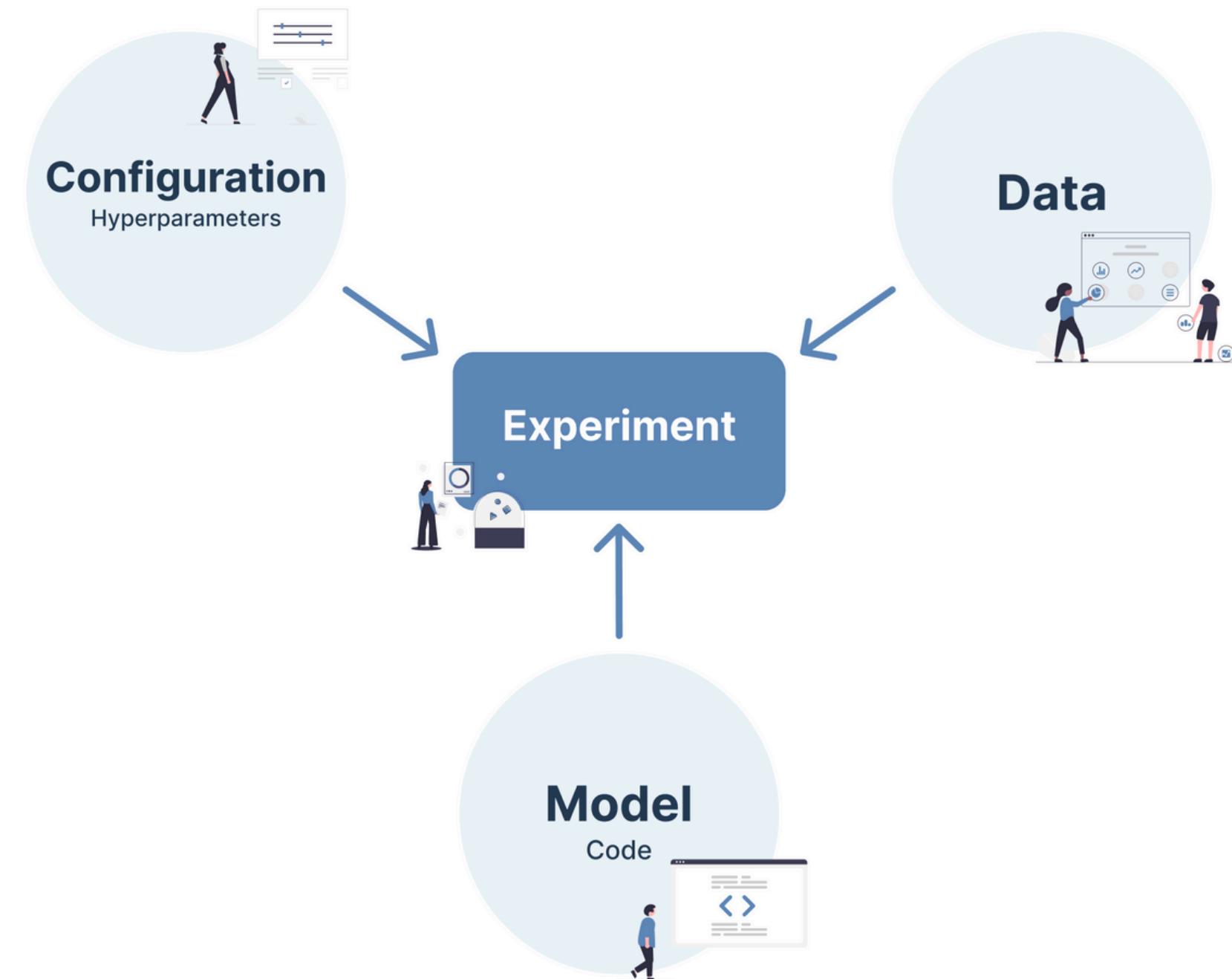
EXPLORER

- CUSTOMER_SATISFACTION
- .vscode
- .zen
- data
- pipelines
- saved_model
- src
- steps
 - clean_data.py
 - ingest_data.py
 - model_train.py
 - __init__.py
 - README.md
 - requirements.txt
 - run_pipeline.py

Version Problem



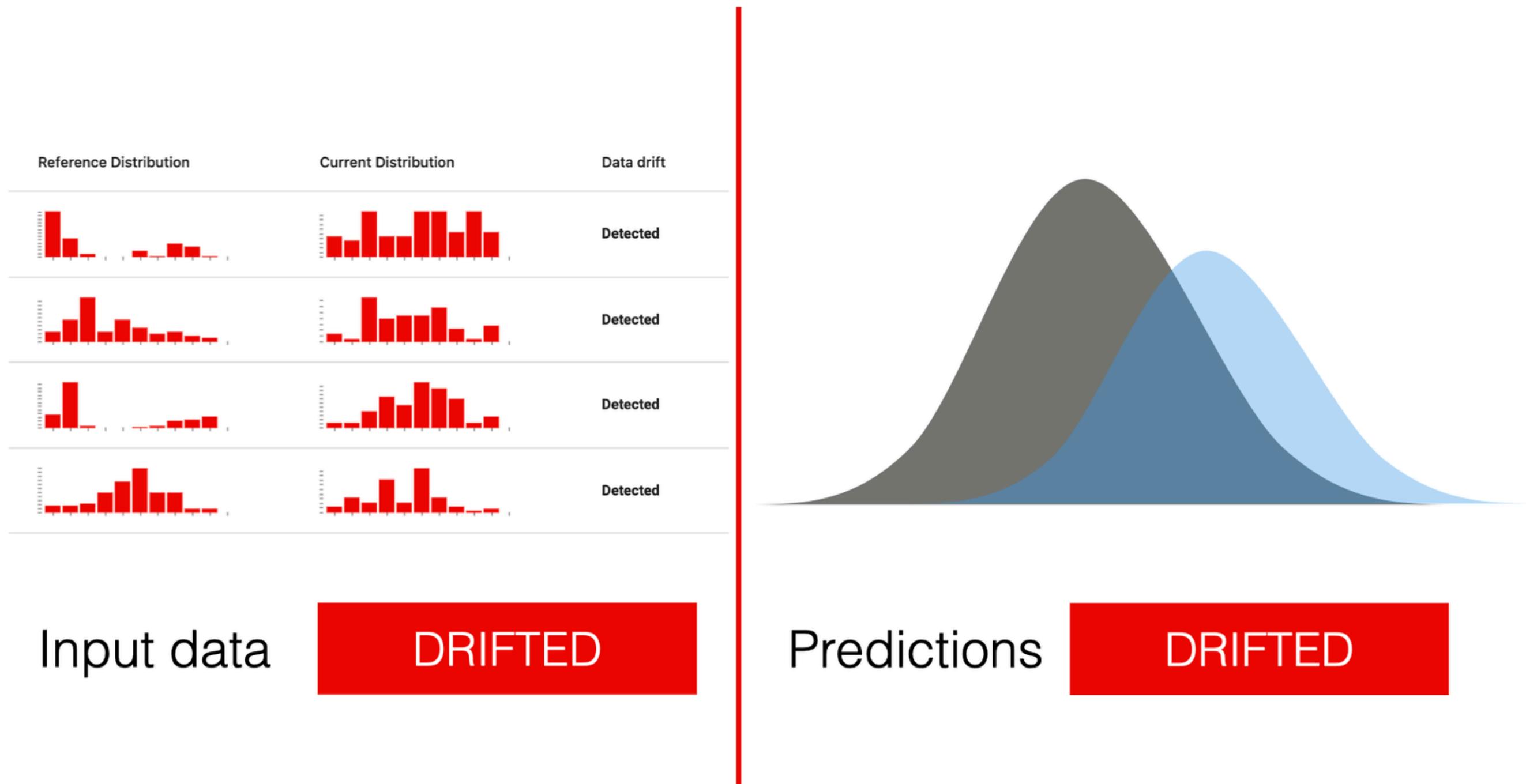
Experiment Problem



Deployment Problem



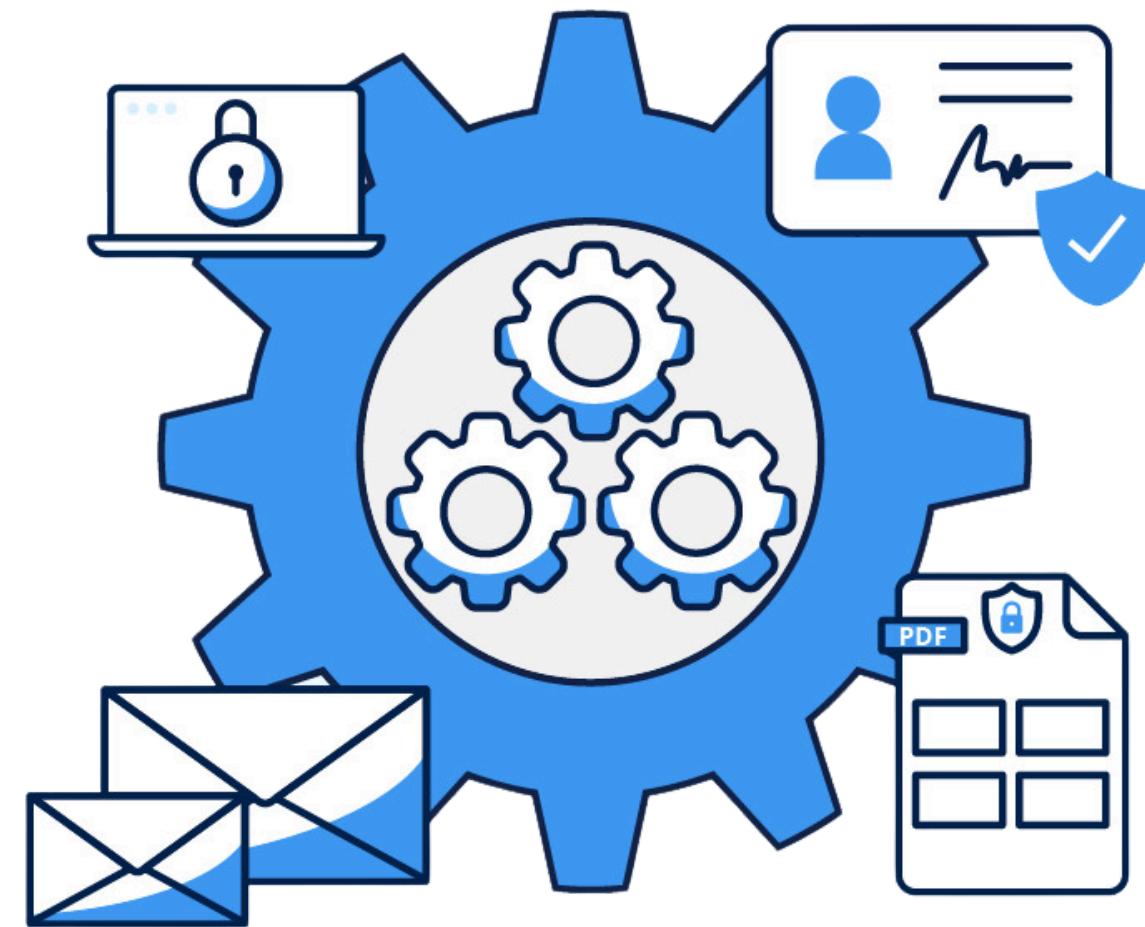
Data Drift Problem



Infrastructure Problem



Automation Problem



Legal Problem



Benefits of MLOps

1. Scalability
2. Improved performance
3. Reproducibility
4. Collaboration and efficiency
5. Risk reduction
6. Cost Savings
7. Faster time to market
8. Better compliance and governance

Challenges

1. Complexity of ml models [variability, black box nature]
2. Quality of data
3. Cost and resource constraints
4. Handling scale
5. Security risks
6. Compliance and regulatory concerns
7. Integration with existing systems
8. Limited Expertise/Skill gap

LINUX FUNDAMENTALS FOR MLOPS

