

```
In [5]: 1 import numpy as np
2 import pandas as pd
3 import warnings
4 import matplotlib.pyplot as plt
5 import seaborn as sns
6 import tensorflow as tf
7 from tensorflow.keras import regularizers
8 import xgboost as xgb
9 from sklearn.decomposition import PCA
10 from sklearn import tree
11 from sklearn.naive_bayes import GaussianNB
12 from sklearn.linear_model import LogisticRegression
13 from sklearn.neighbors import KNeighborsClassifier
14 from sklearn.tree import DecisionTreeClassifier
15 from sklearn.preprocessing import RobustScaler
16 from sklearn.ensemble import RandomForestClassifier, RandomForestRegressor
17 from sklearn.model_selection import train_test_split
18 from sklearn import svm
19 from sklearn import metrics
20 pd.set_option('display.max_columns',None)
21 warnings.filterwarnings('ignore')
22 %matplotlib inline
```

```
In [6]: 1 df = pd.read_csv(r"C:\Users\user\Downloads\KDDTest+.txt\KDDTest+.txt")
```

```
In [7]: 1 # Check data
2 df.head()
```

Out[7]:

	0	tcp	private	REJ	0.1	0.2	0.3	0.4	0.5	0.6	0.7	0.8	0.9	0.10	0.11	0.12	0.13
0	0	tcp	private	REJ	0	0	0	0	0	0	0	0	0	0	0	0	0
1	2	tcp	ftp_data	SF	12983	0	0	0	0	0	0	0	0	0	0	0	0
2	0	icmp	eco_i	SF	20	0	0	0	0	0	0	0	0	0	0	0	0
3	1	tcp	telnet	RSTO	0	15	0	0	0	0	0	0	0	0	0	0	0
4	0	tcp	http	SF	267	14515	0	0	0	0	0	1	0	0	0	0	0

```
In [8]: 1 columns = (['duration','protocol_type','service','flag','src_bytes','dst_b
2 , 'num_failed_logins','logged_in','num_compromised','root_shell','su_attemp
3 , 'num_shells','num_access_files','num_outbound_cmds','is_host_login','is_g
4 , 'srv_serror_rate','rerror_rate','srv_rerror_rate','same_srv_rate','diff_s
5 , 'dst_host_same_srv_rate','dst_host_diff_srv_rate','dst_host_same_src_port
6 , 'dst_host_srv_serror_rate','dst_host_rerror_rate','dst_host_srv_rerror_ra
```

```
In [9]: 1 # Assign name for columns
2 df.columns = columns
```

In [10]: 1 df.head()

Out[10]:

	duration	protocol_type	service	flag	src_bytes	dst_bytes	land	wrong_fragment	urgent
0	0	tcp	private	REJ	0	0	0	0	0
1	2	tcp	ftp_data	SF	12983	0	0	0	0
2	0	icmp	eco_i	SF	20	0	0	0	0
3	1	tcp	telnet	RSTO	0	15	0	0	0
4	0	tcp	http	SF	267	14515	0	0	0

In [11]: 1 df.info()

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 22543 entries, 0 to 22542
Data columns (total 43 columns):
#   Column                                     Non-Null Count  Dtype
---  -
0   duration                                  22543 non-null  int64
1   protocol_type                             22543 non-null  object
2   service                                   22543 non-null  object
3   flag                                       22543 non-null  object
4   src_bytes                                 22543 non-null  int64
5   dst_bytes                                 22543 non-null  int64
6   land                                      22543 non-null  int64
7   wrong_fragment                           22543 non-null  int64
8   urgent                                    22543 non-null  int64
9   hot                                       22543 non-null  int64
10  num_failed_logins                         22543 non-null  int64
11  logged_in                                 22543 non-null  int64
12  num_compromised                           22543 non-null  int64
13  root_shell                                22543 non-null  int64
14  su_attempted                             22543 non-null  int64
15  num_root                                  22543 non-null  int64
16  num_file_creations                        22543 non-null  int64
17  num_shells                                22543 non-null  int64
18  num_access_files                          22543 non-null  int64
19  num_outbound_cmds                         22543 non-null  int64
20  is_host_login                             22543 non-null  int64
21  is_guest_login                            22543 non-null  int64
22  count                                      22543 non-null  int64
23  srv_count                                 22543 non-null  int64
24  serror_rate                              22543 non-null  float64
25  srv_serror_rate                           22543 non-null  float64
26  rerror_rate                               22543 non-null  float64
27  srv_rerror_rate                           22543 non-null  float64
28  same_srv_rate                             22543 non-null  float64
29  diff_srv_rate                             22543 non-null  float64
30  srv_diff_host_rate                        22543 non-null  float64
31  dst_host_count                            22543 non-null  int64
32  dst_host_srv_count                        22543 non-null  int64
33  dst_host_same_srv_rate                    22543 non-null  float64
34  dst_host_diff_srv_rate                    22543 non-null  float64
35  dst_host_same_src_port_rate               22543 non-null  float64
36  dst_host_srv_diff_host_rate               22543 non-null  float64
37  dst_host_serror_rate                      22543 non-null  float64
38  dst_host_srv_serror_rate                  22543 non-null  float64
39  dst_host_rerror_rate                      22543 non-null  float64
40  dst_host_srv_rerror_rate                  22543 non-null  float64
41  outcome                                    22543 non-null  object
42  level                                      22543 non-null  int64
dtypes: float64(15), int64(24), object(4)
memory usage: 7.4+ MB

```

```
In [12]: 1 processed_data_bat_full = pd.DataFrame(df)
2
3 # Specify the path where you want to save the CSV file
4 csv_file_path = 'processed_data_bat_full.csv'
5
6 # Save the DataFrame to a CSV file
7 processed_data_bat_full.to_csv(csv_file_path, index=False)
8
9 # Print a message indicating successful saving
10 print(f'DataFrame saved to '{csv_file_path}')
```

DataFrame saved to 'processed_data_bat_full.csv'

```
In [13]: 1 import mysql.connector
2 from sqlalchemy import create_engine
3 import pandas as pd
4
5 # Replace 'your_username', 'your_password', 'your_database', and 'your_host'
6 db_connection = mysql.connector.connect(
7     user='root',
8     password='12345',
9     host='localhost',
10    database='bat_algo_database'
11 )
12
13 # Path to your CSV file
14 csv_file_path = r'C:\Users\user\BAT_ALGORITHM_FULL\processed_data_bat_full.csv'
15
16 # Read CSV file into a pandas DataFrame
17 df = pd.read_csv(csv_file_path)
18
19 # Define the table name (avoid spaces)
20 table_name = 'data_collected'
21
22 # Create SQLAlchemy engine
23 engine = create_engine('mysql+mysqlconnector://root:12345@localhost/bat_algo_database')
24
25 try:
26     # Create MySQL table based on DataFrame structure
27     df[:0].to_sql(table_name, con=engine, index=False, if_exists='replace')
28
29     # Load data into MySQL table
30     df.to_sql(table_name, con=engine, index=False, if_exists='append')
31
32     print(f'Data has been successfully loaded into the {table_name} table.')
33
34 except Exception as e:
35     print(f'Error: {str(e)}')
36
37 finally:
38     # Close the database connection
39     db_connection.close()
40
```

Data has been successfully loaded into the data_collected table.

```

In [14]: 1 table_name = 'data_collected'
          2
          3 # Create SQLAlchemy engine
          4 engine = create_engine('mysql+mysqlconnector://root:12345@localhost/bat_al
          5
          6 # Query data from MySQL table into a DataFrame
          7 query = f"SELECT * FROM {table_name}"
          8 df = pd.read_sql(query, con=engine)
          9
         10 # Define the path to save the CSV file
         11 csv_file_path = r'C:\Users\user\BAT_ALGORITHM_FULL\exported_data.csv'
         12
         13 # Write the DataFrame to CSV
         14 df.to_csv(csv_file_path, index=False)
         15
         16 print(f'Data from the {table_name} table has been successfully exported to

```

Data from the data_collected table has been successfully exported to C:\User
s\user\BAT_ALGORITHM_FULL\exported_data.csv.

```

In [16]: 1 db_connection.close()

```

```

In [30]: 1 print(df)
          2 data_train=df

```

	protocol_type	service	flag	land	logged_in	is_host_login	\
0	tcp	private	REJ	0	0	0	
1	tcp	ftp_data	SF	0	0	0	
2	icmp	eco_i	SF	0	0	0	
3	tcp	telnet	RSTO	0	0	0	
4	tcp	http	SF	0	1	0	
...	
22538	tcp	smtp	SF	0	1	0	
22539	tcp	http	SF	0	1	0	
22540	tcp	http	SF	0	1	0	
22541	udp	domain_u	SF	0	0	0	
22542	tcp	sunrpc	REJ	0	0	0	

	is_guest_login	outcome	level	duration	src_bytes	dst_bytes	\
0	0	1	21	0.0	-0.188153	-0.076539	
1	0	0	21	2.0	45.048780	-0.076539	
2	0	1	15	0.0	-0.118467	-0.076539	
3	0	1	11	1.0	-0.188153	-0.051581	
4	0	0	21	0.0	0.742160	24.074875	

```
In [31]: 1 data_train.describe().style.background_gradient(cmap='Blues').set_proper...
```

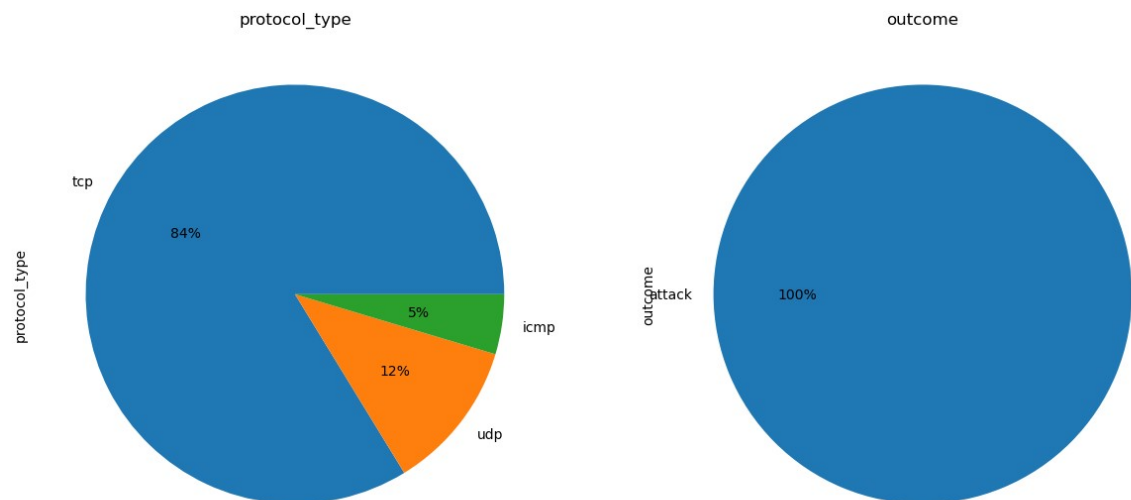
```
Out[31]:
```

	land	logged_in	is_host_login	is_guest_login	level	duration	
count	22543.000000	22543.000000	22543.000000	22543.000000	22543.000000	22543.000000	22543.000000
mean	0.000311	0.442222	0.000488	0.028435	18.017833	218.868784	
std	0.017619	0.496661	0.022085	0.166214	4.270409	1407.207069	1407.207069
min	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	
25%	0.000000	0.000000	0.000000	0.000000	17.000000	0.000000	
50%	0.000000	0.000000	0.000000	0.000000	20.000000	0.000000	
75%	0.000000	1.000000	0.000000	0.000000	21.000000	0.000000	
max	1.000000	1.000000	1.000000	1.000000	21.000000	57715.000000	218868.784000

```
In [32]: 1 data_train.loc[data_train['outcome'] == "normal", "outcome"] = 'normal'
2 data_train.loc[data_train['outcome'] != 'normal', "outcome"] = 'attack'
```

```
In [33]: 1 def pie_plot(df, cols_list, rows, cols):
2     fig, axes = plt.subplots(rows, cols)
3     for ax, col in zip(axes.ravel(), cols_list):
4         df[col].value_counts().plot(ax=ax, kind='pie', figsize=(15, 15), f
5         ax.set_title(str(col), fontsize = 12)
6     plt.show()
```

```
In [34]: 1 pie_plot(data_train, ['protocol_type', 'outcome'], 1, 2)
```



```
In [35]: 1 def Scaling(df_num, cols):
2     std_scaler = RobustScaler()
3     std_scaler_temp = std_scaler.fit_transform(df_num)
4     std_df = pd.DataFrame(std_scaler_temp, columns =cols)
5     return std_df
```

```
In [36]: 1 cat_cols = ['is_host_login', 'protocol_type', 'service', 'flag', 'land', 'logg
2 def preprocess(dataframe):
3     df_num = dataframe.drop(cat_cols, axis=1)
4     num_cols = df_num.columns
5     scaled_df = Scaling(df_num, num_cols)
6
7     dataframe.drop(labels=num_cols, axis="columns", inplace=True)
8     dataframe[num_cols] = scaled_df[num_cols]
9
10    dataframe.loc[dataframe['outcome'] == "normal", "outcome"] = 0
11    dataframe.loc[dataframe['outcome'] != 0, "outcome"] = 1
12
13    dataframe = pd.get_dummies(dataframe, columns = ['protocol_type', 'ser
14    return dataframe
```

```
In [37]: 1 scaled_train = preprocess(data_train)
```

```
In [38]: 1 #Principal Component Analysis
2 x = scaled_train.drop(['outcome', 'level'] , axis = 1).values
3 y = scaled_train['outcome'].values
4 y_reg = scaled_train['level'].values
5
6 pca = PCA(n_components=20)
7 pca = pca.fit(x)
8 x_reduced = pca.transform(x)
9 print("Number of original features is {} and of reduced features is {}".fo
10
11 y = y.astype('int')
12 x_train, x_test, y_train, y_test = train_test_split(x, y, test_size=0.2, r
13 x_train_reduced, x_test_reduced, y_train_reduced, y_test_reduced = train_t
14 x_train_reg, x_test_reg, y_train_reg, y_test_reg = train_test_split(x, y_r
```

Number of original features is 116 and of reduced features is 20

In [39]:

```

1  import numpy as np
2  from sklearn.model_selection import train_test_split
3  from sklearn.ensemble import RandomForestClassifier
4  from sklearn.metrics import accuracy_score, confusion_matrix, classification_report
5
6  # Function to evaluate a solution (subset of features) using a classifier
7  def evaluate_solution(features, X_train, X_test, y_train, y_test):
8      clf = RandomForestClassifier(random_state=42)
9      clf.fit(X_train[:, features], y_train)
10     y_pred = clf.predict(X_test[:, features])
11     return accuracy_score(y_test, y_pred)
12
13 # Bat Algorithm for Feature Selection
14 def bat_algorithm(X_train, X_test, y_train, y_test, num_bats, max_iter, A,
15                  num_features = X_train.shape[1]):
16     best_solution = np.zeros(num_features, dtype=bool)
17     best_score = 0
18
19     # Initialization
20     bats = np.random.rand(num_bats, num_features) < 0.5
21     velocities = np.zeros_like(bats, dtype=float)
22
23     for _ in range(max_iter):
24         # Update bat positions and velocities
25         frequencies = np.zeros(num_bats)
26         for i in range(num_bats):
27             frequencies[i] = alpha * np.exp(-gamma * np.linalg.norm(np.log
28             velocities[i] += np.logical_xor(bats[i], best_solution).astype(float)
29             bats[i] = np.logical_xor(bats[i], (np.random.rand(num_features) < frequencies[i]))
30
31         # Evaluate solutions and update the best solution
32         scores = np.array([evaluate_solution(bat, X_train, X_test, y_train, y_test) for bat in bats])
33         best_bat = np.argmax(scores)
34
35         if scores[best_bat] > best_score:
36             best_score = scores[best_bat]
37             best_solution = np.copy(bats[best_bat])
38
39         # Update velocities and positions
40         velocities += A * np.logical_xor(bats, best_solution).astype(float)
41         bats = np.logical_xor(bats, velocities > np.random.rand(num_bats, num_features) < 0.5)
42
43     return best_solution
44
45 # Generate some dummy data for demonstration purposes
46 X, y = np.random.rand(100, 10), np.random.randint(0, 2, 100)
47 X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
48
49 # Adjust num_bats, max_iter, A, alpha, gamma as needed
50 best_features = bat_algorithm(X_train, X_test, y_train, y_test, num_bats=10, max_iter=100, A=0.9,
51                              alpha=0.01, gamma=0.01)
52 print("Best features selected:", np.where(best_features)[0])
53
54 # Continue with the model creation and evaluation code
55 # Extract the best features for training and testing
56 X_train_selected = X_train[:, best_features]

```



```

56 X_test_selected = X_test[:, best_features]
57
58 # Train a RandomForestClassifier using the selected features
59 clf = RandomForestClassifier(random_state=42)
60 clf.fit(X_train_selected, y_train)
61
62 # Make predictions on the test set
63 y_pred = clf.predict(X_test_selected)
64
65 # Evaluate the performance of the model
66 accuracy = accuracy_score(y_test, y_pred)
67 conf_matrix = confusion_matrix(y_test, y_pred)
68 classification_report_result = classification_report(y_test, y_pred)
69
70 # Print the results
71 print("Accuracy on the test set:", accuracy)
72 print("Confusion Matrix:\n", conf_matrix)
73 print("Classification Report:\n", classification_report_result)
74

```

Best features selected: [0 5 8]

Accuracy on the test set: 0.7

Confusion Matrix:

```
[[9 2]
```

```
[4 5]]
```

Classification Report:

	precision	recall	f1-score	support
0	0.69	0.82	0.75	11
1	0.71	0.56	0.63	9
accuracy			0.70	20
macro avg	0.70	0.69	0.69	20
weighted avg	0.70	0.70	0.69	20

```

In [40]: 1 # Print important information after running the Bat Algorithm
2 print("Best features selected:", np.where(best_features)[0])
3
4 # Evaluate the performance of the selected features on the test set
5 selected_features = np.where(best_features)[0]
6 X_test_selected = X_test[:, selected_features]
7
8 # Train a classifier on the selected features
9 clf_selected = RandomForestClassifier(random_state=42)
10 clf_selected.fit(X_train[:, selected_features], y_train)
11
12 # Make predictions on the test set
13 y_pred_selected = clf_selected.predict(X_test_selected)
14
15 # Calculate and print accuracy
16 accuracy_selected = accuracy_score(y_test, y_pred_selected)
17 print("Accuracy on the test set with selected features:", accuracy_selected)
18
19 # Print confusion matrix and classification report
20 from sklearn.metrics import confusion_matrix, classification_report
21
22 conf_matrix_selected = confusion_matrix(y_test, y_pred_selected)
23 classification_report_selected = classification_report(y_test, y_pred_selected)
24
25 print("Confusion Matrix with Selected Features:\n", conf_matrix_selected)
26 print("Classification Report with Selected Features:\n", classification_report_selected)
27

```

Best features selected: [0 5 8]

Accuracy on the test set with selected features: 0.7

Confusion Matrix with Selected Features:

```
[[9 2]
```

```
[4 5]]
```

Classification Report with Selected Features:

	precision	recall	f1-score	support
0	0.69	0.82	0.75	11
1	0.71	0.56	0.63	9
accuracy			0.70	20
macro avg	0.70	0.69	0.69	20
weighted avg	0.70	0.70	0.69	20

In []:

1