

```
In [1]: import pandas as pd
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import LabelEncoder
from sklearn.linear_model import LogisticRegression
from sklearn.svm import SVC
from sklearn.tree import DecisionTreeClassifier, export_text, plot_tree
from sklearn.metrics import accuracy_score, f1_score
import matplotlib.pyplot as plt
import seaborn as sns

# Загрузка данных
df = pd.read_csv("filtered_dataset.csv")

# Удалим столбец url (неинформативен для модели напрямую)
df = df.drop(columns=["url", "status", "status_encoded"])

# Кодирование категориальных признаков
categorical_cols = ['tld', 'extension']
df_encoded = pd.get_dummies(df, columns=categorical_cols, drop_first=True)

# Разделение на признаки и целевую переменную
X = df_encoded.drop("is_malicious", axis=1)
y = df_encoded["is_malicious"]

# Разделение на обучающую и тестовую выборки
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, ran
```

```
/home/lexcf/.local/lib/python3.10/site-packages/matplotlib/projections/__init__.py:63: UserWarning: Unable to import Axes3D. This may be due to multiple versions of Matplotlib being installed (e.g. as a system package and as a pip package). As a result, the 3D projection is not available.
  warnings.warn("Unable to import Axes3D. This may be due to multiple versions of "
```

```
In [48]: # Обучение моделей
```

```
In [2]: # Логистическая регрессия
print("Логистическая регрессия...")
log_reg = LogisticRegression(max_iter=1000)
log_reg.fit(X_train, y_train)

print("SVM...")
# SVM
svm_model = SVC()
svm_model.fit(X_train, y_train)

print("Дерево решений...")
# Дерево решений
tree_model = DecisionTreeClassifier(random_state=42)
tree_model.fit(X_train, y_train)

print("OK")
```

- Логистическая регрессия...
- SVM...
- Дерево решений...
- OK

```
In [44]: # Сравнение моделей
```

```
In [50]: models = {
    "Logistic Regression": log_reg,
    "SVM": svm_model,
    "Decision Tree": tree_model
}

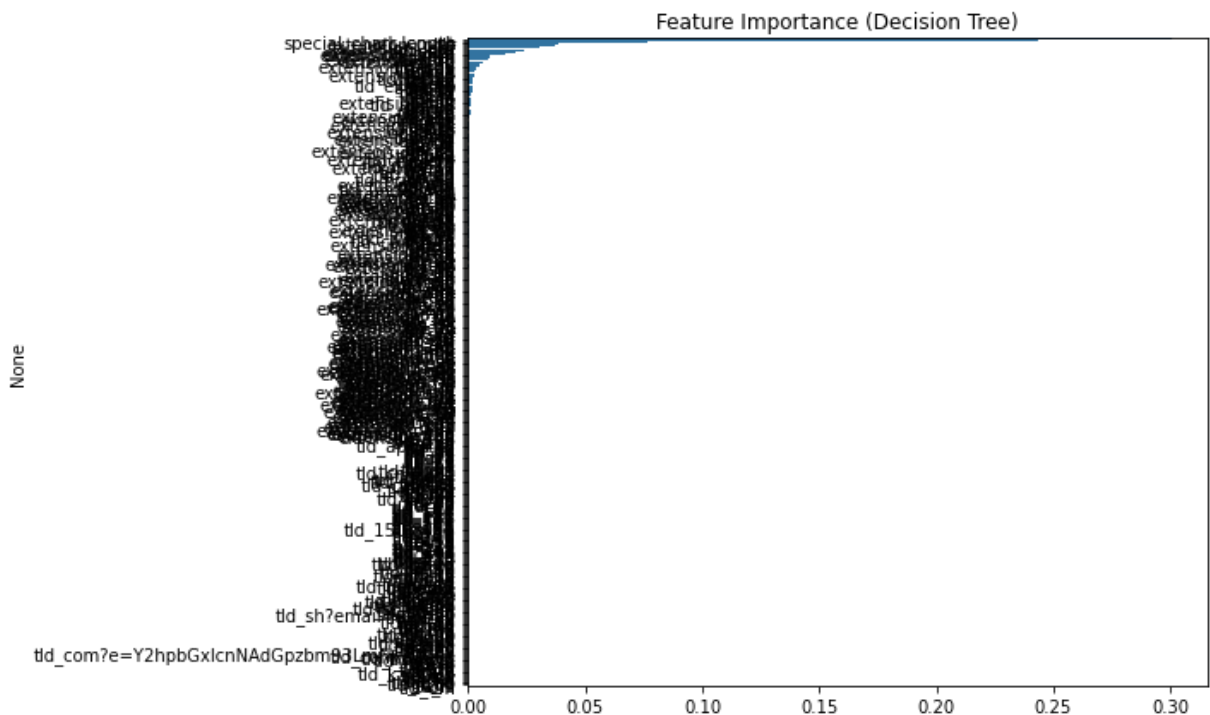
for name, model in models.items():
    y_pred = model.predict(X_test)
    acc = accuracy_score(y_test, y_pred)
    f1 = f1_score(y_test, y_pred)
    print(f"{name}: Accuracy = {acc:.2f}, F1-score = {f1:.2f}")
```

Logistic Regression: Accuracy = 0.76, F1-score = 0.75
SVM: Accuracy = 0.78, F1-score = 0.75
Decision Tree: Accuracy = 0.86, F1-score = 0.86

```
In [ ]: # Визуализация признаков в дереве решений
```

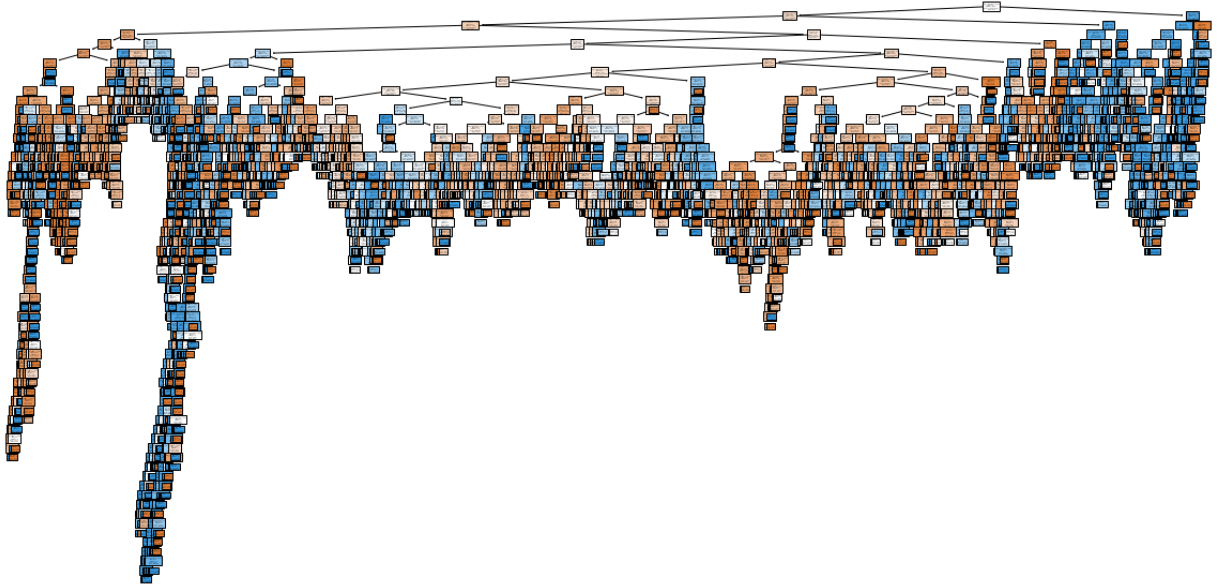
```
In [51]: importances = tree_model.feature_importances_
         feat_importance = pd.Series(importances, index=X.columns).sort_values(ascending=False)

         plt.figure(figsize=(10, 6))
         sns.barplot(x=feat_importance.values, y=feat_importance.index)
         plt.title("Feature Importance (Decision Tree)")
         plt.tight_layout()
         plt.show()
```



```
In [ ]: # Визуализация дерева решений
```

```
In [52]: plt.figure(figsize=(20, 10))  
plot_tree(tree_model, feature_names=X.columns, class_names=["Safe", "Malicious"],  
plt.show()  
rules = export_text(tree_model, feature_names=list(X.columns))  
print(rules)
```



[illegible]


```

|--- tls > 0.50
|   |--- url_length <= -0.67
|   |   |--- class: 1
|   |   |--- url_length > -0.67
|   |   |   |--- class: 0
|   |--- url_length > -0.65
|   |   |--- url_length <= -0.62
|   |   |   |--- url_length <= -0.63
|   |   |   |   |--- class: 0
|   |   |   |--- url_length > -0.63
|   |   |   |   |--- class: 0
|   |   |--- url_length > -0.62
|   |   |   |--- tls <= 0.50
|   |   |   |   |--- url_length <= -0.58
|   |   |   |   |   |--- truncated branch of depth 2
|   |   |   |   |--- url_length > -0.58
|   |   |   |   |   |--- class: 0
|   |   |   |--- tls > 0.50
|   |   |   |   |--- class: 0
|--- special_chars_count > -0.43
|   |--- url_length <= -0.69
|   |   |--- class: 1
|   |--- url_length > -0.69
|   |   |--- url_length <= -0.60
|   |   |   |--- class: 0
|   |   |--- url_length > -0.60
|   |   |   |--- tls <= 0.50
|   |   |   |   |--- url_length <= -0.58
|   |   |   |   |   |--- class: 1
|   |   |   |   |--- url_length > -0.58
|   |   |   |   |   |--- class: 1
|   |   |   |--- tls > 0.50
|   |   |   |   |--- class: 0
|--- url_length > -0.56
|   |--- special_chars_count <= -0.43
|   |   |--- url_length <= -0.42
|   |   |   |--- url_length <= -0.51
|   |   |   |   |--- tls <= 0.50
|   |   |   |   |   |--- special_chars_count <= -0.46
|   |   |   |   |   |   |--- class: 1
|   |   |   |   |   |--- special_chars_count > -0.46
|   |   |   |   |   |   |--- url_length <= -0.53
|   |   |   |   |   |   |   |--- truncated branch of depth 2
|   |   |   |   |   |   |--- url_length > -0.53
|   |   |   |   |   |   |   |--- class: 1
|   |   |   |--- tls > 0.50
|   |   |   |   |--- url_length <= -0.53
|   |   |   |   |   |--- url_length <= -0.54
|   |   |   |   |   |   |--- class: 0
|   |   |   |   |   |--- url_length > -0.54
|   |   |   |   |   |   |--- class: 0
|   |   |   |   |--- url_length > -0.53
|   |   |   |   |   |--- class: 1
|   |   |--- url_length > -0.51
|   |   |   |--- url_length <= -0.49
|   |   |   |   |--- tls <= 0.50

```

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```

|--- tld_ua <= 0.50
|--- truncated branch of depth 2
|--- tld_ua > 0.50
|--- class: 0
|--- url_length > -0.74
|--- extension_none <= 0.50
|--- truncated branch of depth 7
|--- extension_none > 0.50
|--- truncated branch of depth 2
4
|--- tld_app > 0.50
|--- class: 1
|--- url_length > -0.46
|--- tld_br <= 0.50
|--- tls <= 0.50
|--- tld_review <= 0.50
|--- truncated branch of depth 8
|--- tld_review > 0.50
|--- class: 0
|--- tls > 0.50
|--- tld_net <= 0.50
|--- truncated branch of depth 7
|--- tld_net > 0.50
|--- truncated branch of depth 4
|--- tld_br > 0.50
|--- url_length <= -0.42
|--- class: 0
|--- url_length > -0.42
|--- url_length <= -0.40
|--- class: 1
|--- url_length > -0.40
|--- class: 0
|--- special_chars_count > -0.36
|--- tld_edu <= 0.50
|--- tld_ru <= 0.50
|--- tld_net <= 0.50
|--- tld_gov <= 0.50
|--- truncated branch of depth 5
1
|--- tld_gov > 0.50
|--- class: 0
|--- tld_net > 0.50
|--- url_length <= -0.32
|--- truncated branch of depth 8
|--- url_length > -0.32
|--- truncated branch of depth 1
2
|--- tld_ru > 0.50
|--- special_chars_count <= -0.19
|--- extension_none <= 0.50
|--- truncated branch of depth 7
|--- extension_none > 0.50
|--- truncated branch of depth 7
|--- special_chars_count > -0.19
|--- url_length <= -0.26
|--- truncated branch of depth 3

```



```
| | | | | | | | | |--- url_length > -0.26  
| | | | | | | | | |--- truncated branch of depth 6  
| | | | | | | | |--- tld_edu > 0.50  
| | | | | | | | | |--- url_length <= 0.25  
| | | | | | | | | |--- class: 0  
| | | | | | | | |--- url_length > 0.25  
| | | | | | | | | |--- url_length <= 0.32  
| | | | | | | | | |--- class: 1  
| | | | | | | | |--- url_length > 0.32  
| | | | | | | | | |--- class: 0  
| | | | | | | |--- extension_.pdf > 0.50  
| | | | | | | |--- tld_cc <= 0.50  
| | | | | | | |--- class: 0  
| | | | | | | |--- tld_cc > 0.50  
| | | | | | | |--- class: 1  
| | | | | |--- tld_com > 0.50  
| | | | |--- extension_.com <= 0.50  
| | | | |--- url_length <= -0.08  
| | | | |--- special_chars_count <= -0.02  
| | | | | |--- url_length <= -0.24  
| | | | | |--- special_chars_count <= -0.36  
| | | | | | |--- url_length <= -0.60  
| | | | | | |--- truncated branch of depth 6  
| | | | | | |--- url_length > -0.60  
| | | | | | |--- truncated branch of depth 1  
1 | | | | | | | |--- special_chars_count > -0.36  
| | | | | | | |--- tls <= 0.50  
| | | | | | | |--- truncated branch of depth 1  
8 | | | | | | | |--- tls > 0.50  
| | | | | | | |--- truncated branch of depth 1  
3 | | | | | | |--- url_length > -0.24  
| | | | | | |--- special_chars_count <= -0.29  
| | | | | | |--- url_length <= -0.12  
| | | | | | |--- truncated branch of depth 1  
1 | | | | | | |--- url_length > -0.12  
| | | | | | | |--- truncated branch of depth 7  
| | | | | | |--- special_chars_count > -0.29  
| | | | | | |--- extension_.asp <= 0.50  
| | | | | | |--- truncated branch of depth 1  
5 | | | | | | |--- extension_.asp > 0.50  
| | | | | | | |--- class: 0  
| | | | |--- special_chars_count > -0.02  
| | | | |--- extension_.asp <= 0.50  
| | | | |--- url_length <= -0.45  
| | | | | |--- class: 0  
| | | | |--- url_length > -0.45  
| | | | |--- extension_.pdf <= 0.50  
| | | | | |--- truncated branch of depth 1  
4 | | | | | |--- extension_.pdf > 0.50  
| | | | | |--- class: 0
```

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| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- url_length > -0.25  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- special_chars_count > -0.32  
| | | | | | | | | |--- special_chars_count <= -0.29  
| | | | | | | | | |--- url_length <= -0.21  
| | | | | | | | | |--- truncated branch of depth 3  
| | | | | | | | | |--- url_length > -0.21  
| | | | | | | | | |--- truncated branch of depth 2  
| | | | | | | | | |--- special_chars_count > -0.29  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- extension_.br > 0.50  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- extension_.htm > 0.50  
| | | | | | | | | |--- url_length <= -0.14  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- url_length > -0.14  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- extension_.com > 0.50  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- extension_.php > 0.50  
| | | | | | | | | |--- url_length <= 0.04  
| | | | | | | | | |--- special_chars_count <= -0.09  
| | | | | | | | | |--- tld_org <= 0.50  
| | | | | | | | | |--- tld_ir <= 0.50  
| | | | | | | | | |--- tld_com <= 0.50  
| | | | | | | | | |--- tld_int <= 0.50  
| | | | | | | | | |--- tld_az <= 0.50  
| | | | | | | | | |--- url_length <= -0.03  
| | | | | | | | | |--- tld_ru <= 0.50  
| | | | | | | | | |--- truncated branch of depth 6  
| | | | | | | | | |--- tld_ru > 0.50  
| | | | | | | | | |--- truncated branch of depth 4  
| | | | | | | | | |--- url_length > -0.03  
| | | | | | | | | |--- tld_info <= 0.50  
| | | | | | | | | |--- truncated branch of depth 2  
| | | | | | | | | |--- tld_info > 0.50  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- tld_az > 0.50  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- tld_int > 0.50  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- tld_com > 0.50  
| | | | | | | | | |--- url_length <= -0.44  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- url_length > -0.44  
| | | | | | | | | |--- url_length <= -0.42  
| | | | | | | | | |--- special_chars_count <= -0.36  
| | | | | | | | | |--- special_chars_count <= -0.39  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- special_chars_count > -0.39  
| | | | | | | | | |--- class: 1  
| | | | | | | | | |--- special_chars_count > -0.36  
| | | | | | | | | |--- class: 0  
| | | | | | | | | |--- url_length > -0.42  
| | | | | | | | | |--- url length <= -0.24
```

[illegible]

[illegible]

[illegible]


```

|--- tld_ru <= 0.50
|   |--- tld_org <= 0.50
|       |--- tld_com <= 0.50
|           |--- truncated branch of depth 4
|               |--- tld_com > 0.50
|                   |--- truncated branch of depth 1
2
|   |--- tld_org > 0.50
|       |--- tls <= 0.50
|           |--- class: 1
|               |--- tls > 0.50
|                   |--- class: 0
|   |--- tld_ru > 0.50
|       |--- extension_.html <= 0.50
|           |--- class: 1
|               |--- extension_.html > 0.50
|                   |--- class: 0
|   |--- extension_.htm > 0.50
|       |--- tld_kr <= 0.50
|           |--- tld_de <= 0.50
|               |--- class: 0
|                   |--- tld_de > 0.50
|                       |--- class: 1
|               |--- tld_kr > 0.50
|                   |--- class: 1
|   |--- url_length > 1.11
|       |--- tld_ru <= 0.50
|           |--- extension_.aspx <= 0.50
|               |--- extension_.com <= 0.50
|                   |--- special_chars_count <= 1.17
|                       |--- truncated branch of depth 5
|                           |--- special_chars_count > 1.17
|                               |--- class: 1
|                   |--- extension_.com > 0.50
|                       |--- tls <= 0.50
|                           |--- class: 1
|                               |--- tls > 0.50
|                                   |--- truncated branch of depth 2
|                   |--- extension_.aspx > 0.50
|                       |--- tls <= 0.50
|                           |--- class: 0
|                               |--- tls > 0.50
|                                   |--- url_length <= 2.26
|                                       |--- class: 1
|                                           |--- url_length > 2.26
|                                               |--- truncated branch of depth 2
|                   |--- tld_ru > 0.50
|                       |--- special_chars_count <= 3.39
|                           |--- class: 1
|                               |--- special_chars_count > 3.39
|                                   |--- url_length <= 3.44
|                                       |--- class: 0
|                                           |--- url_length > 3.44
|                                               |--- class: 1
|   |--- url_length > 8.55
|       |--- url length <= 8.89

```

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| | | | | | | | |--- class: 0
| | | | | | | | |--- url_length > 8.89
| | | | | | | | |--- class: 1
| | | | | | | | |--- tld_uk > 0.50
| | | | | | | | |--- special_chars_count <= 2.21
| | | | | | | | |--- url_length <= 0.97
| | | | | | | | |--- extension_.html <= 0.50
| | | | | | | | |--- class: 1
| | | | | | | | |--- extension_.html > 0.50
| | | | | | | | |--- class: 0
| | | | | | | | |--- url_length > 0.97
| | | | | | | | |--- class: 0
| | | | | | | | |--- special_chars_count > 2.21
| | | | | | | | |--- class: 1
| | | | | | | | |--- extension_.cmap > 0.50
| | | | | | | | |--- class: 0
| | | | | | | | |--- extension_.pdf > 0.50
| | | | | | | | |--- special_chars_count <= 1.23
| | | | | | | | |--- class: 0
| | | | | | | | |--- special_chars_count > 1.23
| | | | | | | | |--- tld_com <= 0.50
| | | | | | | | |--- class: 0
| | | | | | | | |--- tld_com > 0.50
| | | | | | | | |--- class: 1

```

In []: