

fraudulent transaction detection

September 7, 2024

```
[85]: import pandas as pd
import numpy as np

import warnings
warnings.filterwarnings("ignore", category=DeprecationWarning)

import seaborn as sns
import matplotlib.pyplot as plt
```

```
[86]: data = pd.read_csv('PS_20174392719_1491204439457_log.csv')
```

```
[90]: print('Data does not have any NULL value.')
data.isnull().any()
```

Data does not have any NULL value.

```
[90]: step                False
      type                False
      amount             False
      oldbalanceOrg      False
      newbalanceOrg      False
      oldbalanceDest     False
      newbalanceDest     False
      isFraud            False
      isFlaggedFraud     False
      dtype: bool
```

```
[91]: data.head()
```

```
[91]:
```

	step	type	amount	oldbalanceOrg	newbalanceOrg	oldbalanceDest	\
0	1	PAYMENT	9839.64	170136.0	160296.36	0.0	
1	1	PAYMENT	1864.28	21249.0	19384.72	0.0	
2	1	TRANSFER	181.00	181.0	0.00	0.0	
3	1	CASH_OUT	181.00	181.0	0.00	21182.0	
4	1	PAYMENT	11668.14	41554.0	29885.86	0.0	

	newbalanceDest	isFraud	isFlaggedFraud
0	0.0	0	0

1	0.0	0	0
2	0.0	1	0
3	0.0	1	0
4	0.0	0	0

```
[95]: data.rename(columns={'newbalanceOrig': 'newbalanceOrg'}, inplace=True)
data.drop(labels=['nameOrig', 'nameDest'], axis=1, inplace=True)
```

```
-----
KeyError                                Traceback (most recent call last)
Cell In[95], line 2
      1 data.rename(columns={'newbalanceOrig': 'newbalanceOrg'}, inplace=True)
----> 2 data.drop(labels=['nameOrig', 'nameDest'], axis=1, inplace=True)

File ~/Library/Frameworks/Python.framework/Versions/3.12/lib/python3.12/
site-packages/pandas/core/frame.py:5581, in DataFrame.drop(self, labels, axis,
index, columns, level, inplace, errors)
    5433 def drop(
    5434     self,
    5435     labels: IndexLabel | None = None,
    (...)
    5442     errors: IgnoreRaise = "raise",
    5443 ) -> DataFrame | None:
    5444     """
    5445     Drop specified labels from rows or columns.
    5446     (...)
    5579         weight 1.0      0.8
    5580     """
-> 5581     return super().drop(
    5582         labels=labels,
    5583         axis=axis,
    5584         index=index,
    5585         columns=columns,
    5586         level=level,
    5587         inplace=inplace,
    5588         errors=errors,
    5589     )

File ~/Library/Frameworks/Python.framework/Versions/3.12/lib/python3.12/
site-packages/pandas/core/generic.py:4788, in NDFrame.drop(self, labels, axis,
index, columns, level, inplace, errors)
    4786 for axis, labels in axes.items():
    4787     if labels is not None:
-> 4788         obj = obj._drop_axis(labels, axis, level=level, errors=errors)
    4790 if inplace:
    4791     self._update_inplace(obj)
```

```

File /Library/Frameworks/Python.framework/Versions/3.12/lib/python3.12/
↳site-packages/pandas/core/generic.py:4830, in NDFrame._drop_axis(self, labels,
↳axis, level, errors, only_slice)
    4828         new_axis = axis.drop(labels, level=level, errors=errors)
    4829     else:
-> 4830         new_axis = axis.drop(labels, errors=errors)
    4831     indexer = axis.get_indexer(new_axis)
    4833 # Case for non-unique axis
    4834 else:

File /Library/Frameworks/Python.framework/Versions/3.12/lib/python3.12/
↳site-packages/pandas/core/indexes/base.py:7070, in Index.drop(self, labels,
↳errors)
    7068 if mask.any():
    7069     if errors != "ignore":
-> 7070         raise KeyError(f"{labels[mask].tolist()} not found in axis")
    7071     indexer = indexer[~mask]
    7072 return self.delete(indexer)

KeyError: "[ 'nameOrig', 'nameDest'] not found in axis"

```

```

[96]: print('Minimum value of Amount, Old/New Balance of Origin/Destination:')
data[[ 'amount','oldbalanceOrg', 'newbalanceOrg', 'oldbalanceDest',
↳'newbalanceDest']].min()

```

Minimum value of Amount, Old/New Balance of Origin/Destination:

```

[96]: amount          0.0
      oldbalanceOrg    0.0
      newbalanceOrg    0.0
      oldbalanceDest    0.0
      newbalanceDest    0.0
      dtype: float64

```

```

[97]: print('Maximum value of Amount, Old/New Balance of Origin/Destination:')
data[[ 'amount','oldbalanceOrg', 'newbalanceOrg', 'oldbalanceDest',
↳'newbalanceDest']].max()

```

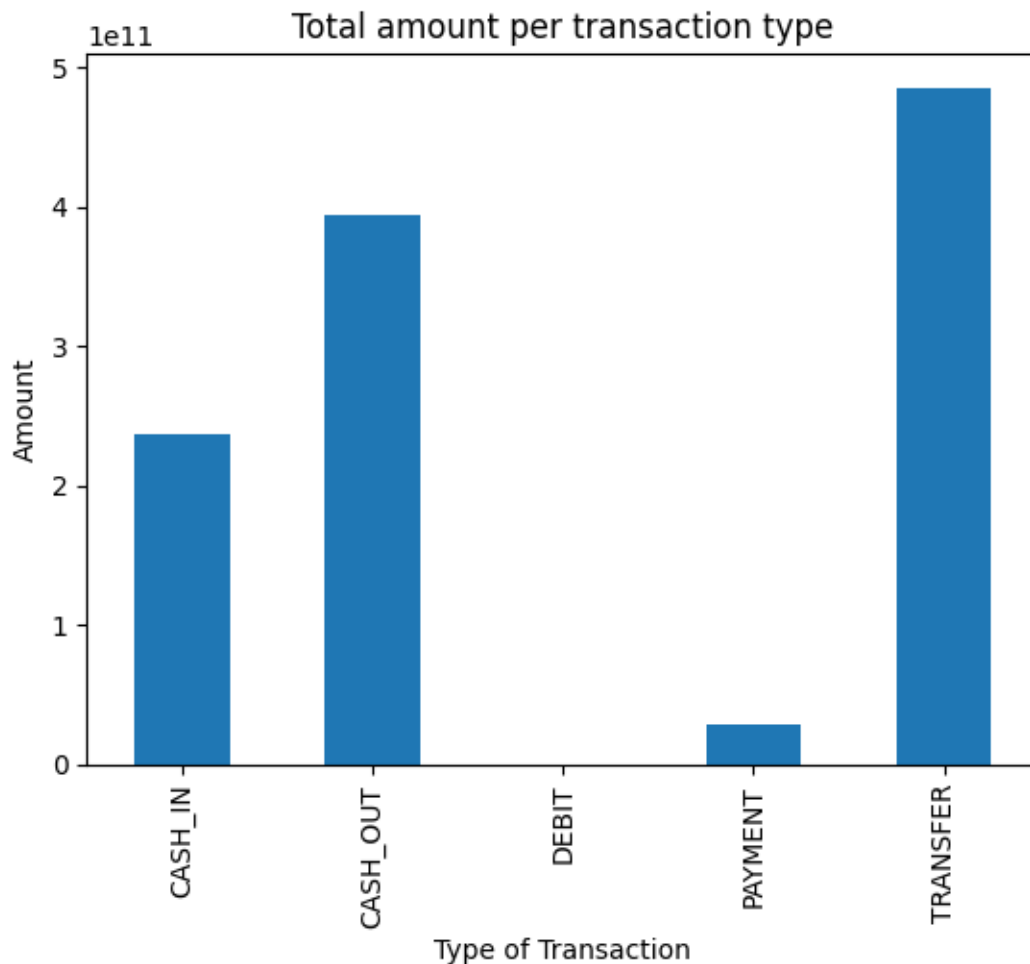
Maximum value of Amount, Old/New Balance of Origin/Destination:

```

[97]: amount          9.244552e+07
      oldbalanceOrg    5.958504e+07
      newbalanceOrg    4.958504e+07
      oldbalanceDest    3.560159e+08
      newbalanceDest    3.561793e+08
      dtype: float64

```

```
[98]: var = data.groupby('type').amount.sum()
fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
var.plot(kind='bar')
ax1.set_title("Total amount per transaction type")
ax1.set_xlabel('Type of Transaction')
ax1.set_ylabel('Amount');
```



```
[99]: data.loc[data.isFraud == 1].type.unique()
```

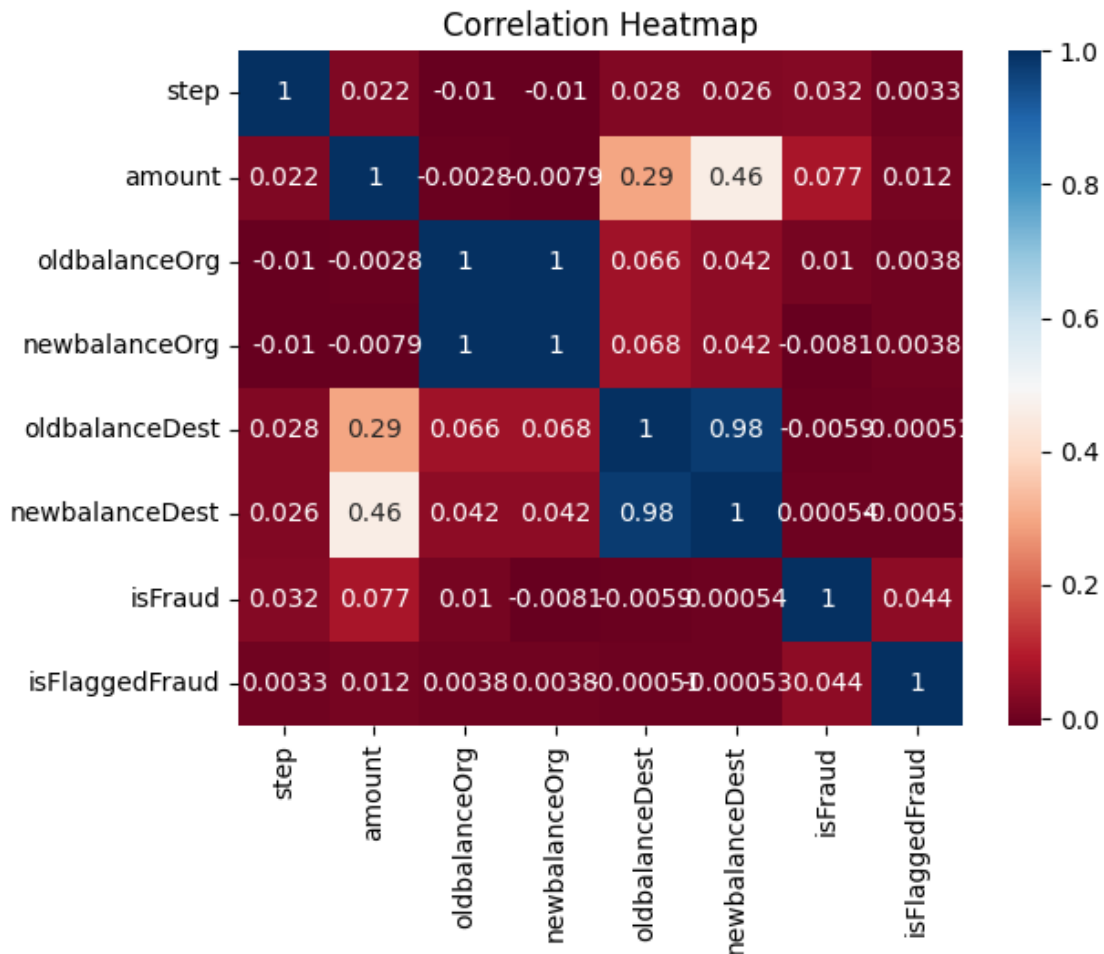
```
[99]: array(['TRANSFER', 'CASH_OUT'], dtype=object)
```

```
[100]: data_numeric = data.apply(pd.to_numeric, errors='coerce')
```

```
[101]: data_numeric = data.select_dtypes(include=['number'])
```

```
[102]: data_numeric = data_numeric.dropna()
```

```
[103]: sns.heatmap(data_numeric.corr(), cmap='RdBu', annot=True)
plt.title('Correlation Heatmap')
plt.show()
```



```
[104]: fraud = data.loc[data.isFraud == 1]
nonfraud = data.loc[data.isFraud == 0]
```

```
[105]: fraudcount = fraud.isFraud.count()
nonfraudcount = nonfraud.isFraud.count()
```

```
[ ]:
```

```
[106]: print('The total number of fraud transaction is {}'.format(data.isFraud.sum()))
print('The total number of fraud transaction which is marked as fraud {}'.
      ↪format(data.isFlaggedFraud.sum()))
print('Ratio of fraud transaction vs non-fraud transaction is 1:{}'.
      ↪format(int(nonfraudcount//fraudcount)))
```

The total number of fraud transaction is 8213.

The total number of fraud transaction which is marked as fraud 16.

Ratio of fraud transaction vs non-fraud transaction is 1:773.

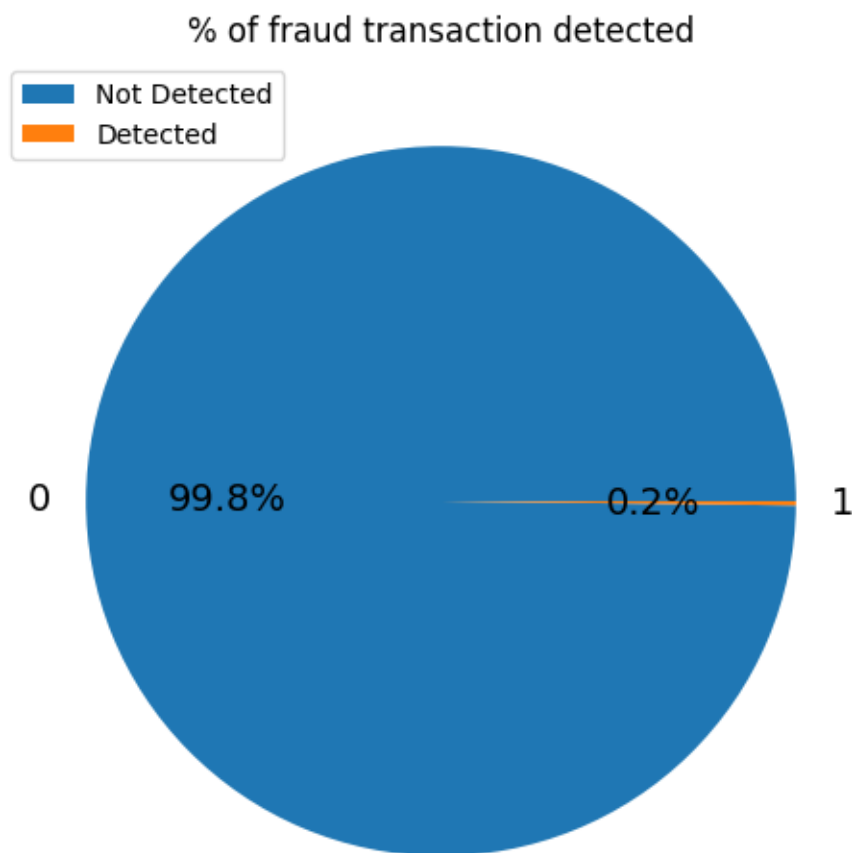
```
[107]: print('Thus in every 773 transaction there is 1 fraud transaction happening.')
print('Amount lost due to these fraud transaction is ${}.'.format(int(fraud.
    ↳ amount.sum())))
```

Thus in every 773 transaction there is 1 fraud transaction happening.

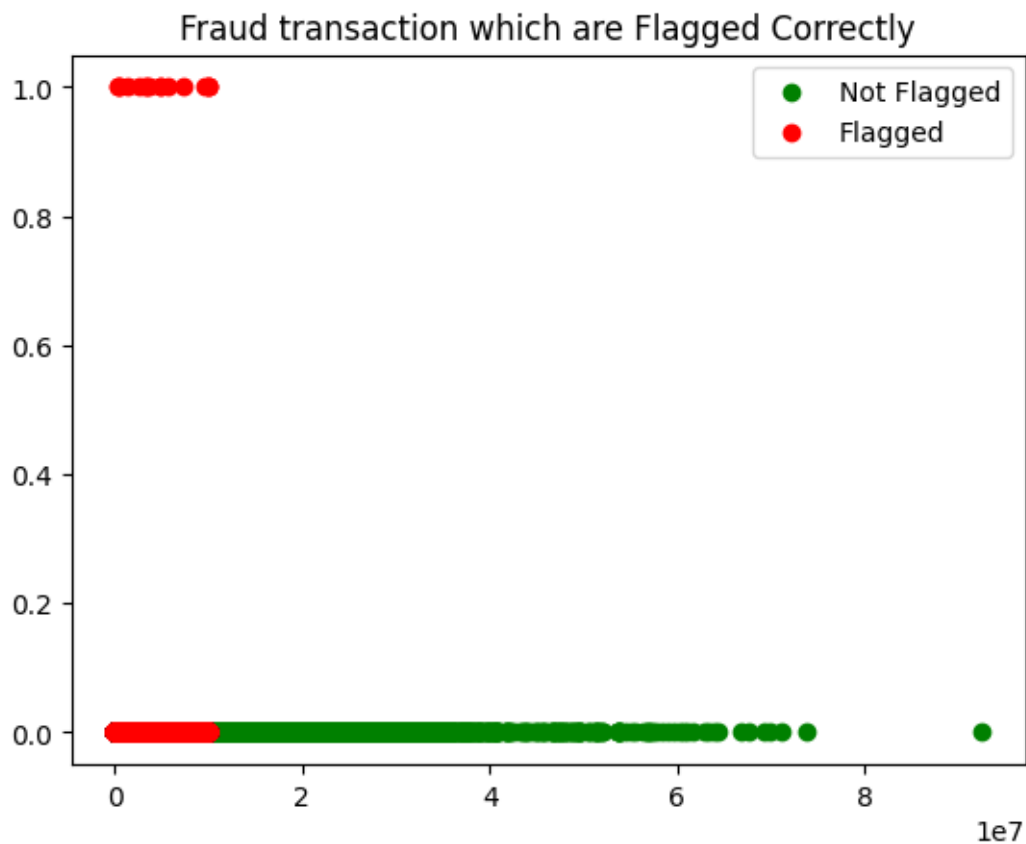
Amount lost due to these fraud transaction is \$12056415427.

```
[108]: piedata = fraud.groupby(['isFlaggedFraud']).sum()
```

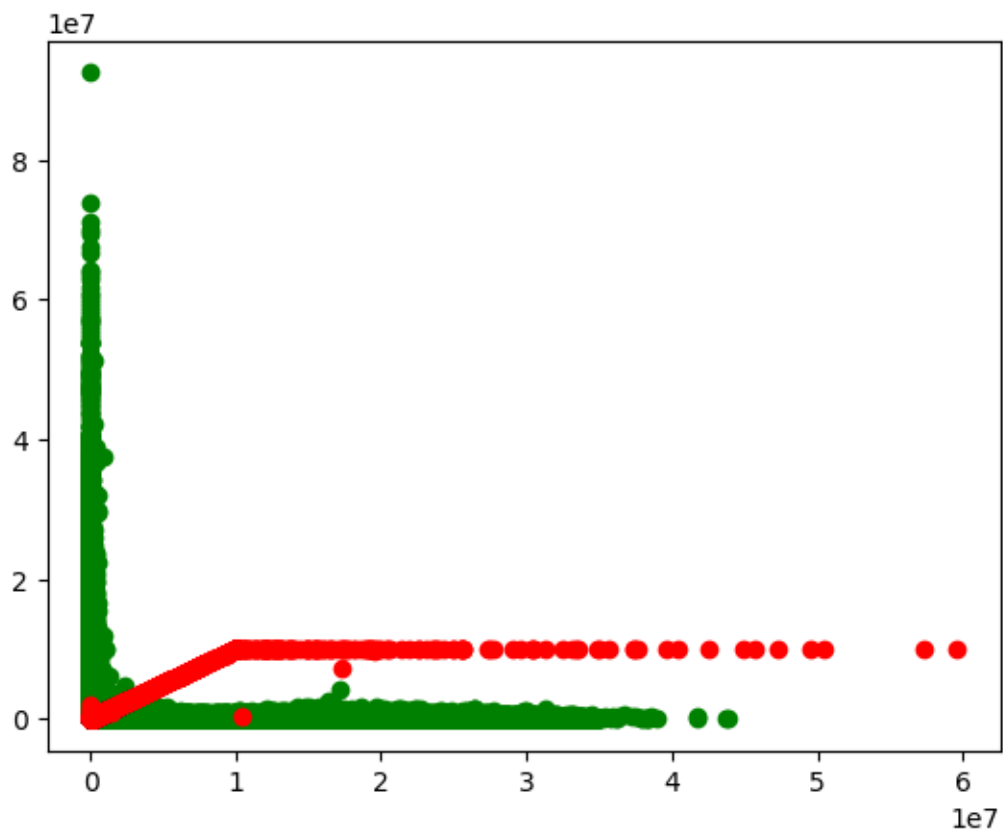
```
[109]: f, axes = plt.subplots(1,1, figsize=(6,6))
axes.set_title("% of fraud transaction detected")
piedata.plot(kind='pie',y='isFraud',ax=axes,
    ↳ fontsize=14,shadow=False,autopct='%1.1f%%');
axes.set_ylabel('');
plt.legend(loc='upper left',labels=['Not Detected','Detected'])
plt.show()
```



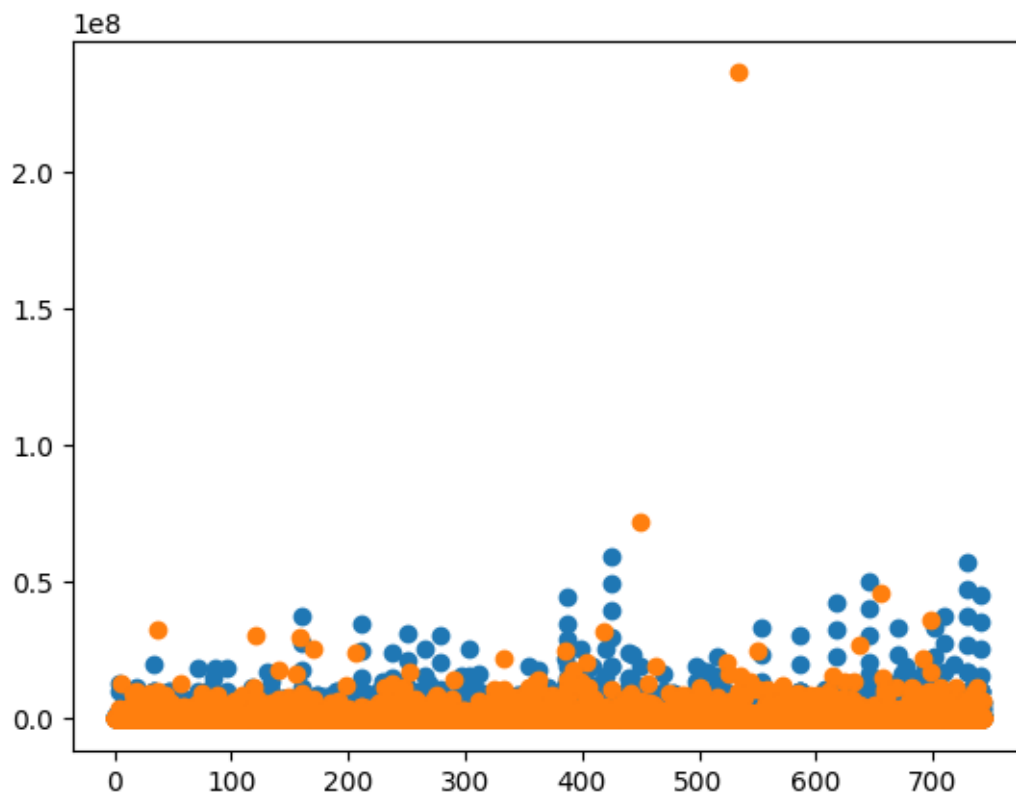
```
[110]: fig = plt.figure()
axes = fig.add_subplot(1,1,1)
axes.set_title("Fraud transaction which are Flagged Correctly")
axes.scatter(nonfraud['amount'],nonfraud['isFlaggedFraud'],c='g')
axes.scatter(fraud['amount'],fraud['isFlaggedFraud'],c='r')
plt.legend(loc='upper right',labels=['Not Flagged','Flagged'])
plt.show()
```



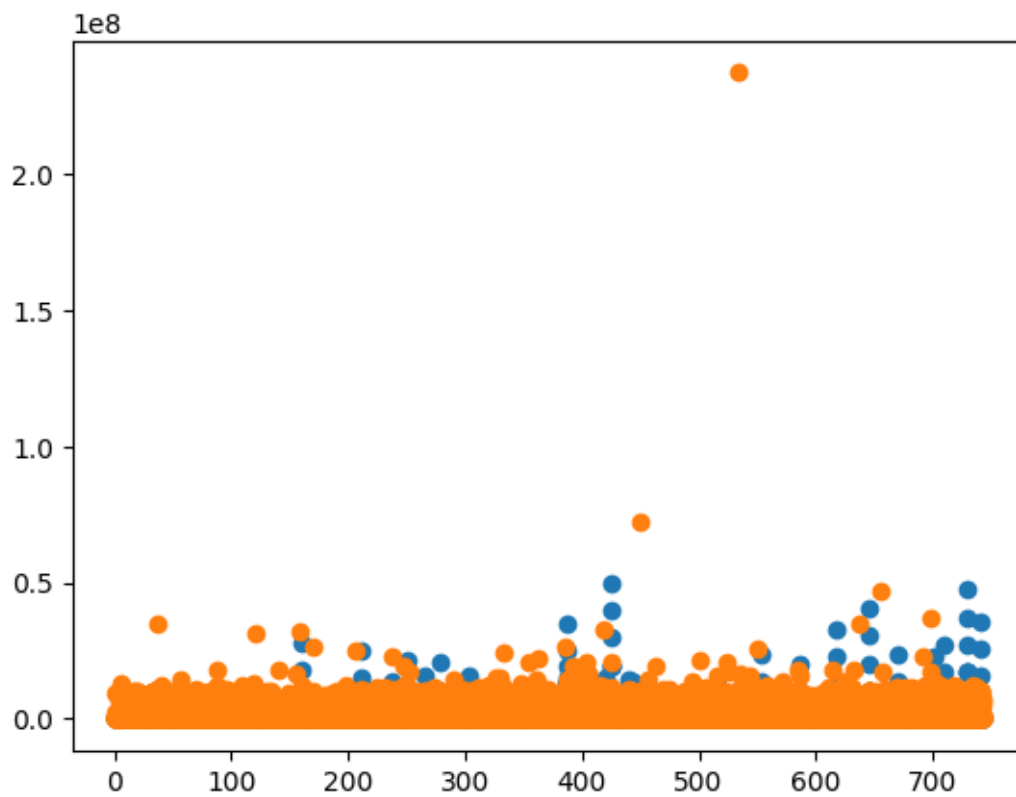
```
[111]: fig = plt.figure()
ax = fig.add_subplot(1,1,1)
ax.scatter(nonfraud['oldbalanceOrg'],nonfraud['amount'],c='g')
ax.scatter(fraud['oldbalanceOrg'],fraud['amount'],c='r')
plt.show()
```



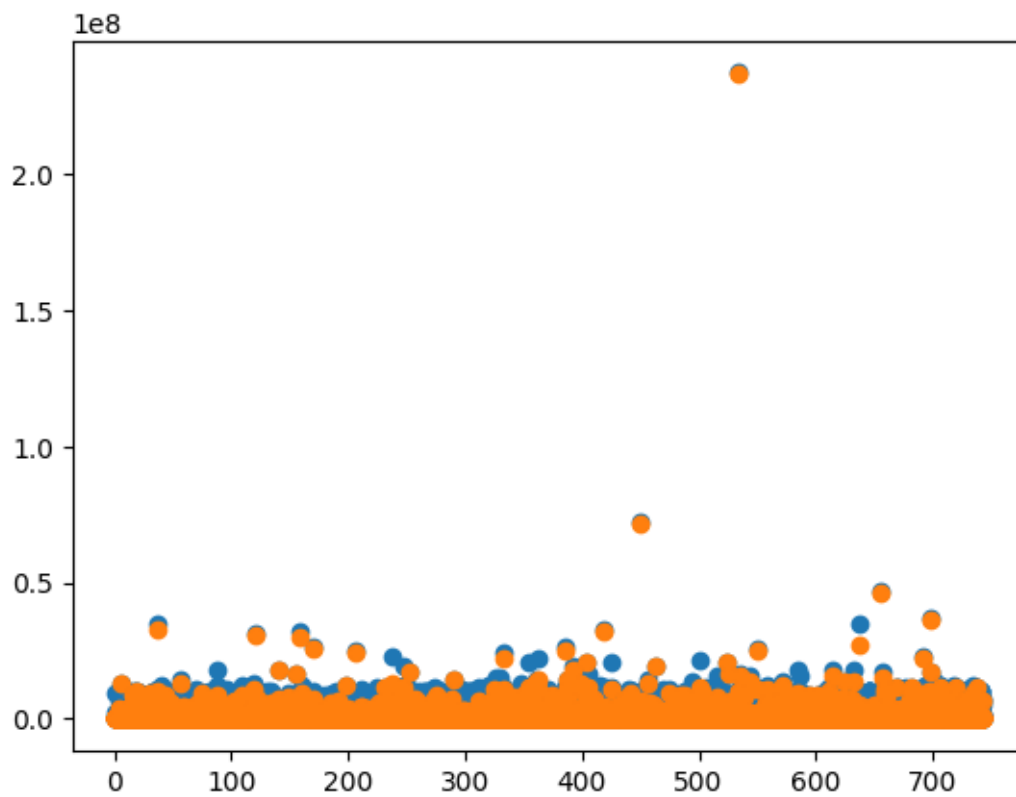
```
[112]: fig = plt.figure()
ax = fig.add_subplot(1,1,1)
ax.scatter(fraud['step'],fraud['oldbalanceOrg'])
ax.scatter(fraud['step'],fraud['oldbalanceDest'])
plt.show()
```

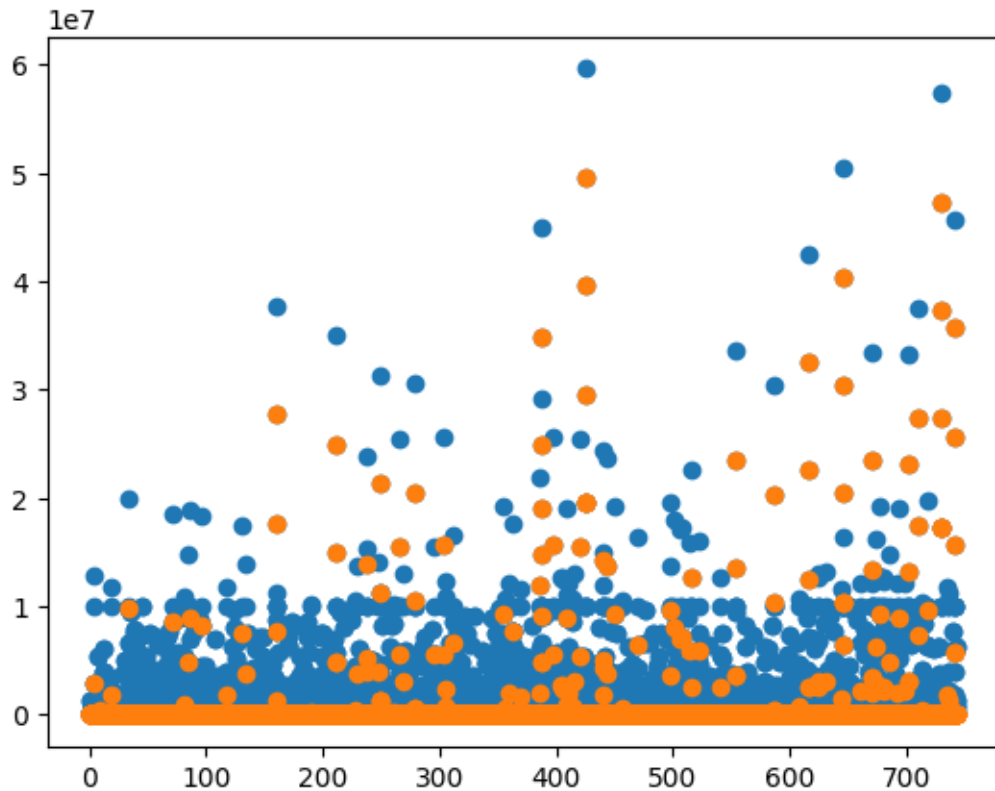
```
[113]: fig = plt.figure()
ax = fig.add_subplot(1,1,1)
ax.scatter(fraud['step'], fraud['newbalanceOrg'])
ax.scatter(fraud['step'], fraud['newbalanceDest'])
plt.show()
```



```
[114]: fig = plt.figure()
ax = fig.add_subplot(1,1,1)
ax.scatter(fraud['step'], fraud['newbalanceDest'])
ax.scatter(fraud['step'], fraud['oldbalanceDest'])
plt.show()
```



```
[115]: fig = plt.figure()
ax = fig.add_subplot(1,1,1)
ax.scatter(fraud['step'], fraud['oldbalanceOrg'])
ax.scatter(fraud['step'], fraud['newbalanceOrg'])
plt.show()
```



```
[116]: import pickle
```

```
[117]: import warnings
warnings.filterwarnings("ignore", category=DeprecationWarning)
```

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```
[118]: data_fraud = pd.read_csv('PS_20174392719_1491204439457_log.csv')
```

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```
[119]: data_fraud = data_fraud.replace(to_replace={'PAYMENT':1, 'TRANSFER':2, 'CASH_OUT':
↪3,
                                                    'CASH_IN':4, 'DEBIT':5, 'No':0, 'Yes':
↪1})
```

```
/var/folders/x/_w99bkln3b125c6p2kgxkrwh0000gn/T/ipykernel_43889/2197214739.py:1
: FutureWarning: Downcasting behavior in `replace` is deprecated and will be
removed in a future version. To retain the old behavior, explicitly call
`result.infer_objects(copy=False)`. To opt-in to the future behavior, set
```

```
`pd.set_option('future.no_silent_downcasting', True)`
data_fraud =
data_fraud.replace(to_replace={'PAYMENT':1,'TRANSFER':2,'CASH_OUT':3,
```

```
[120]: data_fraud.drop(['nameOrig', 'nameDest', 'isFlaggedFraud'], axis=1, inplace=True)
```

```
[121]: data_fraud.head()
```

```
[121]:
```

	step	type	amount	oldbalanceOrg	newbalanceOrig	oldbalanceDest	\
0	1	1	9839.64	170136.0	160296.36	0.0	
1	1	1	1864.28	21249.0	19384.72	0.0	
2	1	2	181.00	181.0	0.00	0.0	
3	1	3	181.00	181.0	0.00	21182.0	
4	1	1	11668.14	41554.0	29885.86	0.0	

	newbalanceDest	isFraud
0	0.0	0
1	0.0	0
2	0.0	1
3	0.0	1
4	0.0	0

```
[122]: X = data_fraud.drop(['isFraud'], axis=1)
y = data_fraud[['isFraud']]
```

```
[123]: from sklearn.model_selection import train_test_split
train_X, test_X, train_y, test_y = train_test_split(X, y, test_size = 0.2,
random_state = 121)
```

```
[124]: from sklearn.ensemble import RandomForestClassifier
clf = RandomForestClassifier(n_estimators=15)
```

```
[125]: if True:
probabilities = clf.fit(train_X, train_y.values.ravel()).predict(test_X)
```

```
[126]: from sklearn.metrics import average_precision_score
if True:
print(average_precision_score(test_y, probabilities))
```

0.774388676557409

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