## 1. Handling Time-stamps

March 31, 2022

```
[1]: # Stages of Data Cleaning
     # 1. Parse date/time (if time-stamps present)
     # 2. Drop un-necessary columns (for machine learning) like ID, etc.
     # 3. Feature Engineering (derive new features from existing features)
     # 4. Data imputation: Fill the missing values (with mode, median, mean, etc.)
     → OR Drop rows with missing values
     # 3. Handling class imbalance: oversampling e.g. SMOTE, ADASYN
     # 5. One Hot Encoding of categorical features
     # 6. Normalization (0-1) / Standarization (mean=0, SD=1)
     # 7. PDimensionality Reduction: Feature Transformation (PCA/t-SNE) or Feature
     ⇒selection (chiq-square test, RFE, etc. )
     # After data cleaning we can perform:
     # Data Modeling (Machine Learning + Regularization) with Hyper-parameter Tuning_
     \hookrightarrow (Grid search)
     # Model Evaluation (Accuracy, Precision, F1 score, Confusion Matrix, AUC) and
      \hookrightarrow Visualization
[2]: import datetime
     import pandas as pd
[3]: df = pd.read_excel("online_retail.xlsx", sheet_name='data',__
     →parse_dates=['InvoiceDate'])
     df.info() # this will help us know the datetime columns which need to be parsed_
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 541909 entries, 0 to 541908
    Data columns (total 8 columns):
     #
         Column
                      Non-Null Count
                                       Dtype
         _____
                      -----
         InvoiceNo
                      541909 non-null int64
     0
         StockCode
                      541909 non-null object
     1
         Description 540455 non-null object
         Quantity
                      541909 non-null int64
         InvoiceDate 541909 non-null datetime64[ns]
                      541909 non-null float64
     5
         UnitPrice
         CustomerID
                      406829 non-null float64
```

```
dtypes: datetime64[ns](1), float64(2), int64(2), object(3)
    memory usage: 33.1+ MB
[4]: df.head(2).transpose()
[4]:
                                                    0
                                                                          1
                                               536365
     InvoiceNo
                                                                     536365
     StockCode
                                               85123A
                                                                      71053
     Description WHITE HANGING HEART T-LIGHT HOLDER WHITE METAL LANTERN
     Quantity
     InvoiceDate
                                 2010-12-01 08:26:00 2010-12-01 08:26:00
     UnitPrice
                                                 2.55
                                                                       3.39
     CustomerID
                                              17850.0
                                                                    17850.0
     Country
                                       United Kingdom
                                                            United Kingdom
[5]: print("Shape of dataset: ", df.shape)
    Shape of dataset: (541909, 8)
[6]: total_customers=len(df['CustomerID'].unique())
     print("Total customers: ", total_customers)
    Total customers: 4373
[7]: df['Date']=[d.date() for d in df['InvoiceDate']]
     df.head(2).transpose()
[7]:
                                                    0
                                                                          1
                                                                     536365
     InvoiceNo
                                               536365
     StockCode
                                               85123A
                                                                     71053
     Description WHITE HANGING HEART T-LIGHT HOLDER WHITE METAL LANTERN
     Quantity
     InvoiceDate
                                 2010-12-01 08:26:00 2010-12-01 08:26:00
     UnitPrice
                                                 2.55
                                                                       3.39
                                              17850.0
                                                                    17850.0
     CustomerID
     Country
                                       United Kingdom
                                                            United Kingdom
     Date
                                           2010-12-01
                                                                2010-12-01
[8]: x=df['Date'].value_counts()
     print("Total transactions per date:\n",x)
    Total transactions per date:
     2011-12-05
                   5331
    2011-12-08
                  4940
    2011-11-29
                  4313
    2011-11-16
                  4195
    2011-11-11
                  4089
```

541909 non-null object

Country

```
2011-03-13
                    537
     2010-12-19
                    522
     2011-05-01
                    452
     2010-12-22
                    291
     2011-02-06
                    279
     Name: Date, Length: 305, dtype: int64
 [9]: df['year'] = df['InvoiceDate'].dt.year.astype(int)
      df['month'] = df['InvoiceDate'].dt.month.astype(int)
      df['day'] = df['InvoiceDate'].dt.day.astype(int)
      df['day_name'] = df['InvoiceDate'].dt.weekday
      df['hour'] = df['InvoiceDate'].dt.hour.astype(int)
      df['minute'] = df['InvoiceDate'].dt.minute.astype(int)
      print(df.head(2).transpose())
                                                     0
                                                                          1
     InvoiceNo
                                               536365
                                                                     536365
     StockCode
                                               85123A
                                                                      71053
     Description WHITE HANGING HEART T-LIGHT HOLDER
                                                       WHITE METAL LANTERN
     Quantity
     InvoiceDate
                                  2010-12-01 08:26:00
                                                        2010-12-01 08:26:00
     UnitPrice
                                                  2.55
                                                                       3.39
     CustomerID
                                              17850.0
                                                                    17850.0
     Country
                                       United Kingdom
                                                             United Kingdom
                                           2010-12-01
     Date
                                                                 2010-12-01
                                                 2010
                                                                       2010
     year
                                                    12
     month
                                                                         12
     day
                                                     1
                                                                          1
                                                     2
                                                                          2
     day_name
     hour
                                                     8
                                                                          8
     minute
                                                    26
                                                                         26
[10]: # transactions of last 30 days
      date_cutoff = df['InvoiceDate'].max() - datetime.timedelta(30, 0, 0)
      df['active'] = (df['InvoiceDate'] > date_cutoff).astype(int)
      print(df.head(2).transpose())
                                                     0
                                                                          1
     InvoiceNo
                                               536365
                                                                     536365
     StockCode
                                               85123A
                                                                      71053
     Description WHITE HANGING HEART T-LIGHT HOLDER
                                                       WHITE METAL LANTERN
     Quantity
     InvoiceDate
                                  2010-12-01 08:26:00
                                                       2010-12-01 08:26:00
     UnitPrice
                                                 2.55
                                                                       3.39
     CustomerID
                                              17850.0
                                                                    17850.0
     Country
                                       United Kingdom
                                                             United Kingdom
                                           2010-12-01
     Date
                                                                 2010-12-01
```

```
2010
                                                                        2010
     year
     month
                                                    12
                                                                          12
                                                     1
                                                                           1
     day
     day_name
                                                     2
                                                                           2
     hour
                                                     8
                                                                           8
                                                    26
                                                                          26
     minute
     active
                                                     0
                                                                           0
[11]: df = df.drop(["Country", "UnitPrice", "StockCode", "Description"], axis=1)
      df = df.drop(["year", "month", "day", "hour", "minute"], axis=1)
      df.head(5).transpose()
[11]:
                                      0
                                                            1
                                                                                  2 \
      {\tt InvoiceNo}
                                 536365
                                                       536365
                                                                             536365
      Quantity
      InvoiceDate 2010-12-01 08:26:00 2010-12-01 08:26:00
                                                               2010-12-01 08:26:00
      CustomerID
                                17850.0
                                                      17850.0
                                                                            17850.0
      Date
                             2010-12-01
                                                   2010-12-01
                                                                         2010-12-01
      day_name
                                                                                  2
      active
                                      0
                                                                                  0
                                                            0
                                      3
                                                            4
      InvoiceNo
                                 536365
                                                       536365
      Quantity
                                      6
                                                            6
      InvoiceDate 2010-12-01 08:26:00
                                         2010-12-01 08:26:00
      CustomerID
                                17850.0
                                                      17850.0
      Date
                             2010-12-01
                                                   2010-12-01
      day_name
                                      2
                                                            2
      active
                                      0
                                                            0
 []:
```