Using google.colab to import datasets from google drive by mounting the drive. Have uploaded both the datasets directly there. Can use the upload functionality of the same. But I prefer mounting the drive.

```
!pip install pyspark
from google.colab import drive
drive.mount('/content/drive')
Collecting pyspark
  Downloading pyspark-3.5.1.tar.gz (317.0 MB)
                                     --- 317.0/317.0 MB 2.8 MB/s eta
0:00:00
etadata (setup.py) ... ent already satisfied: py4j==0.10.9.7 in
/usr/local/lib/python3.10/dist-packages (from pyspark) (0.10.9.7)
Building wheels for collected packages: pyspark
  Building wheel for pyspark (setup.py) ... e=pyspark-3.5.1-py2.py3-
none-any.whl size=317488491
sha256=2b1c9293c4f8f0e4a508310a7fb45da1fa42df0afeb1ce0d94da1023b3202c6
  Stored in directory:
/root/.cache/pip/wheels/80/1d/60/2c256ed38dddce2fdd93be545214a63e02fbd
8d74fb0b7f3a6
Successfully built pyspark
Installing collected packages: pyspark
Successfully installed pyspark-3.5.1
Mounted at /content/drive
```

#### Importing Libraries

```
import os
import numpy as np
import pandas as pd
import shutil
import pyspark
from pyspark.sql.functions import when, count, col, sum,
regexp replace
from pyspark import SparkContext
import pyspark.sql.functions as psf
from pyspark.sql import SparkSession
from pyspark.sql import SparkSession, SQLContext, Window
from pyspark.sql.types import IntegerType
from pyspark.ml.clustering import KMeans
from pyspark.ml.feature import VectorAssembler
spk0bi =
pyspark.sql.SparkSession.builder.appName("vekal Assignment 2").getOrCr
eate()
```

```
spk0bj.conf.set("spark.sql.repl.eagerEval.enabled", True)
spk0bj
<pyspark.sql.session.SparkSession at 0x7f91a7fc5c90>
```

### **QUESTION 1**

```
QUE1 NYC = spk0bj.read.format("csv").option("header",
"true").option("inferSchema",
"true").load('/content/drive/MyDrive/Parking Violations Issued -
Fiscal Year 2024 20240411.csv')
QUE1 NYC.show(n=2, truncate=False, vertical=True)
-RECORD 0------
 Summons Number
                                     1159637337
 Plate ID
                                     KZH2758
Registration State
                                    NY
 Plate Type
                                     PAS
 Issue Date
                                     06/09/2023
Violation Code
                                     67
Vehicle Body Type
                                    VAN
Vehicle Make
                                     HONDA
 Issuing Agency
 Street Code1
                                     0
 Street Code2
                                     0
 Street Code3
                                    0
Vehicle Expiration Date
                                     20250201
Violation Location
                                     43
Violation Precinct
                                     43
 Issuer Precinct
                                     43
                                     972773
 Issuer Code
 Issuer Command
                                     0043
 Issuer Squad
                                     0000
Violation Time
                                     0911A
Time First Observed
                                     NULL
Violation County
                                     BX
Violation In Front Of Or Opposite
                                     NULL
House Number
                                     NULL
 Street Name
                                     I/O TAYLOR AVE
 Intersecting Street
                                     GUERLAIN
Date First Observed
                                     0
 Law Section
                                     408
 Sub Division
                                     E5
Violation Legal Code
                                     NULL
 Days Parking In Effect
                                     BBBBBBB
 From Hours In Effect
                                     ALL
```

To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  Wethicle Year  Meter Number Feet From Curb Violation Post Code Violation Dost Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation Null NULL NULL NULL NULL NULL NULL NULL NU		
Unregistered Vehicle?  Vehicle Year Meter Number Feet From Curb Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation RECORD 1  RECORD 1  Registration State Plate ID Registration State Plate Type Issue Date Violation Code Vehicle Body Type Vehicle Make Issuing Agency Street Code1 Street Code2 Street Code3 Street Code3 Street Code3 Street Code4 Street Code5 Issuer Precinct Issuer Precinct Issuer Precinct Issuer Squad Violation Time Time First Observed House Number Intersecting Street Date Vehicle Ode Days Parking In Effect Vehicle Color Unregistered Vehicle?	To Hours In Effect	ALL
Vehicle Year Meter Number Feet From Curb Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation RECORD 1	Vehicle Color	BLUE
Meter Number Feet From Curb Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation RECORD 1	Unregistered Vehicle?	0
Feet From Curb Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation NULL NULL NULL NULL NULL NULL NULL NUL	Vehicle Year	2006
Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation NULL NULL NULL NULL NULL NULL NULL NUL	Meter Number	-
Violation Post Code Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation NULL NULL NULL NULL NULL NULL NULL NUL	Feet From Curb	0
Violation Description No Standing or Stopping Violation Hydrant Violation Double Parking Violation		
No Standing or Stopping Violation   Hydrant Violation   NULL   Double Parking Violation   NULL   RECORD 1		
Hydrant Violation Double Parking Violation RECORD 1		
Double Parking Violation RECORD 1		
RECORD 1		
Summons Number   1252960645 Plate ID   JPD8746 Registration State   NY Plate Type   PAS Issue Date   06/30/2023 Violation Code   87 Vehicle Body Type   SUBN Vehicle Make   LINCO Issuing Agency   M Street Code1   17870 Street Code2   25390 Street Code3   32670 Vehicle Expiration Date   20240210 Violation Location   14 Violation Precinct   14 Issuer Precinct   14 Issuer Code   271057 Issuer Code   271057 Issuer Command   0968 Issuer Squad   0000 Violation Time   0717A Time First Observed   NULL Violation In Front Of Or Opposite   House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		NOLL
Plate ID Registration State Plate Type Issue Date Violation Code Vehicle Body Type Vehicle Make Issuing Agency Street Code1 Street Code2 Street Code3 Vehicle Expiration Date Violation Precinct Issuer Precinct Issuer Precinct Issuer Command Issuer Command Issuer Command Issuer Squad Violation Time Time First Observed Violation In Front Of Or Opposite House Number Street Name Intersecting Street Intersecting Street Date First Observed Violation Legal Code Days Parking In Effect From Hours In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  PAS INY PAS SUP PAS NY PAS SUBN NY SUBN VENCY VAR SUBN VENCY VAR SUBN VENCY VAR SUBN VENCY VAR		1252060645
Registration State   NY Plate Type   PAS   Issue Date   06/30/2023   Violation Code   87   SUBN   Vehicle Body Type   SUBN   LINCO   Issuing Agency   M   Street Code1   17870   Street Code2   25390   Street Code3   32670   Vehicle Expiration Date   20240210   Violation Location   14   Violation Precinct   14   Issuer Precinct   968   Issuer Code   271057   Issuer Code   271057   Issuer Command   0968   Issuer Squad   0000   Violation Time   0717A   Time First Observed   NULL   Violation In Front Of Or Opposite   House Number   51   Street Name   E 44TH ST   Intersecting Street   NULL   Date First Observed   0   Law Section   408   Sub Division   D   Violation Legal Code   NULL   Date First Observed   NULL   Date First Observed   0   Law Section   408   Sub Division   D   Violation Legal Code   NULL   Date First Observed   ALL   To Hours In Effect   ALL   To Hours In Effect   ALL   To Hours In Effect   ALL   Vehicle Color   GRAY   Unregistered Vehicle ?   0   Vehicle Year   2020		
Plate Type Issue Date  Violation Code Vehicle Body Type Vehicle Make ISSUINN Vehicle Make ISSUINN Vehicle Make ISSUINN Street Codel ISSUINN Street Code2 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct ISSUIN Vehicle Expiration Date Violation Precinct ISSUIN Vehicle Expiration Date Violation Precinct ISSUIN VIOLATION V		
Issue Date Violation Code Vehicle Body Type Vehicle Make ISSUIN Vehicle Make ISSUIN Vehicle Code1 Street Code2 Street Code2 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Issuer Precinct ISSUER Code ISSUER Command ISSUER Command ISSUER Command Violation Time Violation Time Violation Time Violation Time Violation County Violation County Violation Time Violation Time First Observed Violation Tine First Observed Violation Tine First Observed Violation Time Violation County Violation Time Violation Time Violation Street Violation Violation Legal Code Violation County Violation Legal Code Violation County Viola		
Violation Code Vehicle Body Type Vehicle Make ILINCO Issuing Agency Street Code1 Street Code2 Street Code3 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Issuer Code Issuer Squad Issuer Squad Violation Time Ime First Observed Violation County Violation In Front Of Or Opposite House Number Intersecting Street Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  Street Name I ALL Vehicle Year IINCO ITRO ITRO ITRO ITRO ITRO INTO INTO INTO INTO INTO INTO INTO INT		
Vehicle Body Type Vehicle Make LINCO Issuing Agency Street Code1 Street Code2 Street Code3 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Issuer Precinct Issuer Code Issuer Squad Violation Time Violation Time Violation Time Violation Tome Violation Tome Violation Tome Violation Tome Violation Tome Violation Tome Violation In Front Of Or Opposite House Number Street Name Intersecting Street Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  NM  NM  NM  SUBN  NBN  17870  8088  1271057  14  14  14  14  14  14  14  17870  968 1271057  1968 19717  1968 19717  1971		
Vehicle Make   LINCO   Issuing Agency   M   Street Codel   17870   Street Code2   25390   Street Code3   32670   Vehicle Expiration Date   20240210   Violation Location   14   Violation Precinct   14   Issuer Precinct   968   Issuer Code   271057   Issuer Command   0968   Issuer Squad   0000   Violation Time   0717A   Time First Observed   NULL   Violation County   NY   Violation In Front Of Or Opposite   House Number   51   Street Name   E 44TH ST   Intersecting Street   NULL   Date First Observed   0   Law Section   408   Sub Division   D   Violation Legal Code   NULL   Date First Observed   ALL   To Hours In Effect   ALL   To Hours In Effect   ALL   Vehicle Color   GRAY   Unregistered Vehicle?   0   Vehicle Year   2020		
Issuing Agency Street Codel		
Street Code1 Street Code2 Street Code3 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Issuer Precinct Issuer Code Issuer Command Issuer Squad Violation Time Violation Time Violation Time Violation Time First Observed Violation County Violation In Front Of Or Opposite Nuble Violation In Front Of Or Opposite Violation First Violation In Front Of Or Opposite Violation Legal Code Law Section Violation Legal Code		
Street Code2 Street Code3 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Violation Precinct Visuer Code Violation Code Violation Violation Violation Precinct Violation Precinct Violation Violation Violation Code Violation Time Violation Time Violation County Violation In Front Of Or Opposite Violation In Front Of Or Opposite Violation V		
Street Code332670Vehicle Expiration Date20240210Violation Location14Violation Precinct14Issuer Precinct968Issuer Code271057Issuer Command0968Issuer Squad0000Violation Time0717ATime First ObservedNULLViolation CountyNYViolation In Front Of Or Opposite0House Number51Street NameE 44TH STIntersecting StreetNULLDate First Observed0Law Section408Sub DivisionDViolation Legal CodeNULLDays Parking In EffectBBBBBBBFrom Hours In EffectALLTo Hours In EffectALLVehicle ColorGRAYUnregistered Vehicle?0Vehicle Year2020		
Vehicle Expiration Date Violation Location Violation Precinct Issuer Precinct Issuer Code Issuer Command Issuer Squad Violation Time Violation Time Violation Tome Violation Tome Violation In Front Of Or Opposite House Number Street Name Ister Name Ister Null Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect To Hours In Effect Vehicle Color Vehicle Year Violation Violation Violation Location Violation Location Violation Legal Code Days Parking In Effect Vehicle Color Vehicle Year Vehicle Year Violation V		
Violation Location   14 Violation Precinct   14 Issuer Precinct   968 Issuer Code   271057 Issuer Command   0968 Issuer Squad   0000 Violation Time   0717A Time First Observed   NULL Violation County   NY Violation In Front Of Or Opposite   0 House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Violation Precinct   14 Issuer Precinct   968 Issuer Code   271057 Issuer Command   0968 Issuer Squad   0000 Violation Time   0717A Time First Observed   NULL Violation County   NY Violation In Front Of Or Opposite   0 House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Issuer Precinct Issuer Code Issuer Command Issuer Squad Violation Time O717A Time First Observed Violation County Violation In Front Of Or Opposite House Number Street Name Intersecting Street NULL Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect From Hours In Effect To Hours In Effect Vehicle Color Vehicle Year  968 271057 1707 1708 1708 1709 1709 1707 1707 1707 1707 1707 1707		
Issuer Code Issuer Command Issuer Squad Violation Time Violation County Violation In Front Of Or Opposite House Number Street Name Intersecting Street Null Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect From Hours In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year    0000   0717A   NULL   NY VIULL   NY VIULL   NULL	Violation Precinct	14
Issuer Command Issuer Squad Violation Time O717A Time First Observed Violation County Violation In Front Of Or Opposite House Number Street Name Intersecting Street NULL Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  O717A NULL NY VOULL NY VULL NY VOULL NY VOULL NULL NULL NULL NULL NULL NULL NULL	Issuer Precinct	968
Issuer Squad Violation Time 7	Issuer Code	271057
Violation Time Time First Observed Violation County Violation In Front Of Or Opposite House Number Street Name It 44TH ST Intersecting Street NULL Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  NULL O717A NULL NAME NULL NAME NULL NAME NULL BRBBBBBB FROM HOURS IN EFFECT ALL Vehicle Year  O717A NULL NAME NULL SHAPP NULL OR OF ANT OF AUST OF ANT OF AUST OF ANT OF AUST	Issuer Command	0968
Time First Observed   NULL   Violation County   NY   Violation In Front Of Or Opposite   O   House Number   51   Street Name   E 44TH ST   Intersecting Street   NULL   Date First Observed   O   Law Section   408   Sub Division   D   Violation Legal Code   NULL   Days Parking In Effect   BBBBBBB   From Hours In Effect   ALL   To Hours In Effect   ALL   Vehicle Color   GRAY   Unregistered Vehicle?   O   Vehicle Year   2020	Issuer Squad	0000
Violation County Violation In Front Of Or Opposite   O House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   O Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   O Vehicle Year   2020	Violation Time	0717A
Violation County Violation In Front Of Or Opposite   O House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   O Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   O Vehicle Year   2020	Time First Observed	NULL
Violation In Front Of Or Opposite   0 House Number   51 Street Name   E 44TH ST Intersecting Street   NULL Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020	Violation County	NY
House Number Street Name Intersecting Street NULL Date First Observed Law Section Sub Division Violation Legal Code Days Parking In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year    51   E 44TH ST   NULL   D0   WULL   D0   WULL   D1   WULL   BBBBBBB   From Hours In Effect   ALL   Vehicle Year   CRAY   Unregistered Vehicle?   COLOR   COLOR   CRAY   Unregistered Vehicle?   COLOR		0
Street Name   E 44TH ST   Intersecting Street   NULL   Date First Observed   0   Law Section   408   Sub Division   D   Violation Legal Code   NULL   Days Parking In Effect   BBBBBBB   From Hours In Effect   ALL   To Hours In Effect   ALL   Vehicle Color   GRAY   Unregistered Vehicle?   0   Vehicle Year   2020		
Intersecting Street   NULL Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Date First Observed   0 Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Law Section   408 Sub Division   D Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Sub Division Violation Legal Code Days Parking In Effect From Hours In Effect To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year    D   D   D   D   D   D   D   D   D		
Violation Legal Code   NULL Days Parking In Effect   BBBBBBB From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Days Parking In Effect   BBBBBBB   From Hours In Effect   ALL   To Hours In Effect   ALL   Vehicle Color   GRAY   Unregistered Vehicle?   0   Vehicle Year   2020		
From Hours In Effect   ALL To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
To Hours In Effect   ALL Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Vehicle Color   GRAY Unregistered Vehicle?   0 Vehicle Year   2020		
Unregistered Vehicle?   0 Vehicle Year   2020		
Vehicle Year   2020		
TICECT NUMBET		
	TICCCT NUMBER	

```
Feet From Curb
Violation Post Code
Violation Description
No Standing or Stopping Violation | NULL
Hydrant Violation
Double Parking Violation | NULL
only showing top 2 rows
```

#### Number of Rows and Columns

```
print("Total Number of Rows: " , QUE1_NYC.count())
print("Total Number of Columns: " , len(QUE1_NYC.columns))

Total Number of Rows: 10717482
Total Number of Columns: 43
```

#### Schema

```
QUE1 NYC.printSchema()
root
 |-- Summons Number: long (nullable = true)
 -- Plate ID: string (nullable = true)
 -- Registration State: string (nullable = true)
 -- Plate Type: string (nullable = true)
 -- Issue Date: string (nullable = true)
 |-- Violation Code: integer (nullable = true)
 -- Vehicle Body Type: string (nullable = true)
 -- Vehicle Make: string (nullable = true)
 -- Issuing Agency: string (nullable = true)
 -- Street Code1: integer (nullable = true)
 |-- Street Code2: integer (nullable = true)
  -- Street Code3: integer (nullable = true)
 -- Vehicle Expiration Date: integer (nullable = true)
 -- Violation Location: integer (nullable = true)
 -- Violation Precinct: integer (nullable = true)
 -- Issuer Precinct: integer (nullable = true)
  -- Issuer Code: integer (nullable = true)
  -- Issuer Command: string (nullable = true)
  -- Issuer Squad: string (nullable = true)
 -- Violation Time: string (nullable = true)
 -- Time First Observed: string (nullable = true)
 -- Violation County: string (nullable = true)
 |-- Violation In Front Of Or Opposite: string (nullable = true)
 -- House Number: string (nullable = true)
 |-- Street Name: string (nullable = true)
 -- Intersecting Street: string (nullable = true)
 |-- Date First Observed: integer (nullable = true)
```

```
|-- Law Section: integer (nullable = true)
|-- Sub Division: string (nullable = true)
|-- Violation Legal Code: string (nullable = true)
-- Days Parking In Effect
                              : string (nullable = true)
|-- From Hours In Effect: string (nullable = true)
-- To Hours In Effect: string (nullable = true)
-- Vehicle Color: string (nullable = true)
-- Unregistered Vehicle?: integer (nullable = true)
-- Vehicle Year: integer (nullable = true)
-- Meter Number: string (nullable = true)
-- Feet From Curb: integer (nullable = true)
|-- Violation Post Code: string (nullable = true)
-- Violation Description: string (nullable = true)
|-- No Standing or Stopping Violation: string (nullable = true)
-- Hydrant Violation: string (nullable = true)
|-- Double Parking Violation: string (nullable = true)
```

### Sample Data

QUE1_NYC.selectExpr("*").show(1)
QUEI_NYC.selectExpr("*").snow(I)  +
Code1 Street Code2 Street Code3 Vehicle Expiration Date Violation Location Violation Precinct Issuer Precinct Issuer Code Issuer Command Issuer Squad Violation Time Time First Observed Violation County Violation In Front Of Or Opposite House Number  Street Name  Intersecting Street Date First Observed Law Section Sub Division  Violation Legal Code Days Parking In Effect  From Hours In Effect  To Hours In Effect Vehicle Color Unregistered Vehicle? Vehicle Year  Meter Number Feet From Curb Violation Post Code Violation Description  No Standing or Stopping Violation Hydrant Violation Double Parking Violation  +

```
+-----
   1159637337| KZH2758|
                           NY |
                                  PAS | 06/09/2023 |
                                PΙ
67 |
                   HONDA I
           VANI
                                        0|
                    20250201
                                     431
0 |
43|
          43|
                972773|
                           0043|
                                    0000|
0911A|
              NULL
                           BX|
NULL
        NULL|I/O TAYLOR AVE|
                             GUERLAIN|
      408|
0 |
                E5|
                             NULL
BBBBBBB |
                 ALL
                             ALL
                                      BLUE |
                           0|
      2006
                                       NULLI
NULL
                       NULL
                                   NULL
NULL
           -----+------
  ------
   -----
only showing top 1 row
```

#### Null Values in the dataset

```
Plate Type
Issue Date
                                     0
Violation Code
                                     0
Vehicle Body Type
                                     28486
Vehicle Make
                                     10679
Issuing Agency
Street Code1
                                     0
Street Code2
                                     0
                                     0
Street Code3
Vehicle Expiration Date
                                     0
Violation Location
                                     4923863
Violation Precinct
Issuer Precinct
                                     0
Issuer Code
                                     0
Issuer Command
                                     4918591
                                     5292644
Issuer Squad
Violation Time
                                     336
Time First Observed
                                     10087137
Violation County
                                     102892
Violation In Front Of Or Opposite
                                     4973482
House Number
                                     5015875
Street Name
                                     1507
Intersecting Street
                                     4980009
Date First Observed
                                     0
Law Section
                                     0
Sub Division
                                     1767
Violation Legal Code
                                     5799044
Days Parking In Effect
                                     5014718
From Hours In Effect
                                     7338955
To Hours In Effect
                                     7338965
Vehicle Color
                                     1015121
Unregistered Vehicle?
                                     10490502
Vehicle Year
                                     0
Meter Number
                                     9381186
Feet From Curb
Violation Post Code
                                     5519326
Violation Description
                                     227812
No Standing or Stopping Violation | 10717482
Hydrant Violation
                                     10717482
Double Parking Violation
                                     10717482
```

## Pre-processing and Handling Null Values

```
QUE1_NYC = QUE1_NYC.dropna(subset=['Violation Time'])
QUE1_NYC = QUE1_NYC.dropna(subset=['Vehicle Body Type'])
```

```
QUE1 NYC = QUE1 NYC.dropna(subset=['Violation Location'])
QUE1 NYC = QUE1 NYC.dropna(subset=['Vehicle Color'])
QUE1 NYC.select([count(when(col(column).isNull(),
column)).alias(column) for column in
OUE1 NYC.columns]).show(vertical=True)
-RECORD 0-----
 Summons Number
                                    0
 Plate ID
                                    0
                                    0
Registration State
 Plate Type
                                    0
Issue Date
                                    0
Violation Code
                                    0
Vehicle Body Type
                                    0
Vehicle Make
                                    5004
 Issuing Agency
                                    0
 Street Code1
                                    0
 Street Code2
                                    0
 Street Code3
                                    0
Vehicle Expiration Date
                                    0
Violation Location
                                    0
Violation Precinct
                                    0
                                    0
 Issuer Precinct
 Issuer Code
                                    0
 Issuer Command
                                    0
Issuer Squad
                                    372077
Violation Time
                                    0
Time First Observed
                                    5135396
Violation County
                                    16740
Violation In Front Of Or Opposite |
                                    49635
House Number
                                    90803
 Street Name
                                    442
 Intersecting Street
                                    4776952
Date First Observed
                                    0
Law Section
                                    0
 Sub Division
                                    617
Violation Legal Code
                                    5757591
Days Parking In Effect
                                    95438
 From Hours In Effect
                                    2418019
To Hours In Effect
                                    2418029
 Vehicle Color
                                    0
                                    5566827
 Unregistered Vehicle?
Vehicle Year
                                    0
Meter Number
                                    4458269
 Feet From Curb
 Violation Post Code
                                    562687
 Violation Description
                                   190942
No Standing or Stopping Violation | 5757591
```

### Create View for NYC Parking Data

```
QUE1_NYC = QUE1_NYC.withColumn('Issue Year',
psf.year(psf.to_date(QUE1_NYC['Issue Date'], 'MM/dd/yyyy')))
QUE1_NYC.createOrReplaceTempView("QUE1_NYCView")
```

# When are tickets most likely to be issued? (15 pts)

```
spkObj.sql("SELECT `Violation Time`, COUNT(*) AS Ticket Frequency FROM
QUE1_NYCView GROUP BY `Violation Time` ORDER BY Ticket_Frequency
DESC").show()
|Violation Time|Ticket_Frequency|
          0836A1
                           16176
          0838A1
                           15559
          0839A1
                           15544
          0840A1
                           15381
          0906A|
                           15142
          0841A|
                           15017
          0837A1
                           14901
          0842A1
                           14724
          0908A|
                           14488
          0843A|
                           14430
          0845A|
                           14408
          0910A|
                           14388
          0909A I
                           14379
          0907A|
                           142631
          0844A|
                           14226
          1140A|
                           13978
          0846A1
                           138991
          1141A|
                           13789
          1139A|
                           13713
          0911AI
                           13706
only showing top 20 rows
```

#### Answer:

• We have our maximum number of violators i.e 16176 at 0836A which 8:36 AM.

# What are the most common years and types of cars to be ticketed? (15 pts)

spkObj.sql("SELECT `Vehicle Body Type` as `Type of Car`,`Issue Year`,
COUNT(\*) AS `Violation\_Count` FROM QUE1\_NYCView WHERE (`Vehicle Year`
> 0) GROUP BY `Vehicle Body Type`, `Issue Year` ORDER BY
`Violation\_Count` DESC").show()

+	+	++
Type of Car	Issue Year	Violation_Count
+	+	++
SUBN	2023	1455740
j 4DSD		:
j SUBN	2024	i 470615 i
į VAN	2023	438855
i 4DSD		•
i VAN	2024	137466
i PICK	2023	100055
j DELV	2023	85359
j 2DSD	2023	•
j SDN		!
j REFG	2023	39034
j PICK	2024	32876
j DELV	2024	25891
i 2DSD	2024	-
i CONV	2023	
i REFG	2024	12309
j UTIL	2023	•
j TRAC	2023	10499
j SDN	2024	9530
j SEDN	2023	8616
+	+	++
only showing	top 20 rows	5

#### Answer:

• The most common year seems to be 2023 and the most common car seems to be SUBN.

Issue Year Column was created with the help of issue date. Which was then used to find most common years and the type of vehicle.

# Where are tickets most commonly issued? (15 pts)

```
spkObj.sql("SELECT `Violation Location`, COUNT(*) AS No_of_tickets
FROM QUE1 NYCView GROUP BY 'Violation Location' ORDER BY count(*)
DESC").show()
|Violation Location|No_of_tickets|
                            275694
                 1141
                            211702
                            207346
                   61
                  131
                            1888221
                  141
                            177747
                 1091
                            153290
                   11
                            147416
                  18|
                            147053
                   91
                            141548
                 115|
                            135019
                  61|
                            116063
                            115531
                  661
                  201
                            115337
                 112|
                            109566
                  701
                            107169
                  841
                            103834
                 103|
                            103248
                 108|
                            102315
                  52 l
                            101996
                  46|
                             98129
only showing top 20 rows
```

#### Answer:

• Most number of tickets have been issued at Location 19

The Violation Location was used to find the location where most tickets were issued.

# Which color of the vehicle is most likely to get a ticket? (15 pts)

spkObj.sql("SELECT `Vehicle Color`, COUNT(\*) as Ticket\_Count FROM
QUE1\_NYCView GROUP BY `Vehicle Color` ORDER BY COUNT(\*) DESC").show()

1.71.1	11005711
WH	1100571
GY	1013560
BK  WHITE	867338
	598915
BLACK	389161
BL	348480
GREY  RD	301436  194491
BLUE	136469
SILVE	129919
BROWN	129532
RED	98815
GR	72157
TN	36762
OTHER	33153
BR	32054
BLK	31434
GREEN	25426
YW	24872
GL	21431

### Answer:

• WH is the most ticket issued vehicle with 1100571 tickets issued.

The vehicle colour column was used to find which coloured vehicle was most frequently ticketed.

spkObj.stop()

Based on a K-Means algorithm, please try to answer the following question: Given a Black vehicle parking illegally at 34510, 10030, 34050 (street codes). What is the probability that it will get an ticket? (very rough prediction). (20 pts)

```
spkObj = SparkSession.builder \
.appName('vekal_Assignment_2') \
.master('local[*]') \
.config('spark.sql.execution.arrow.pyspark.enabled', True) \
.config('spark.sql.session.timeZone', 'UTC') \
.config('spark.driver.memory','32G') \
.config('spark.ui.showConsoleProgress', True) \
.config('spark.sql.repl.eagerEval.enabled', True) \
.getOrCreate()

spkObj
<pyspark.sql.session.SparkSession at 0x7f91a7f91f30>
```

#### Reading the Data

```
QUE1_NYC = spk0bj.read.format("csv").option("header",
  "true").option("inferSchema","true").load('/content/drive/MyDrive/
Parking_Violations_Issued_-
    Fiscal_Year_2024_20240411.csv').select('Street Code1', 'Street
Code2', 'Street Code3', 'Vehicle Color')

QUE1_NYC = QUE1_NYC.select(QUE1_NYC['Street Code1'].cast('float'),
    QUE1_NYC['Street Code2'].cast('float'), QUE1_NYC['Street
Code3'].cast('float'), QUE1_NYC['Vehicle Color'])

from pyspark.ml.clustering import KMeans
from pyspark.ml.feature import VectorAssembler
import pyspark.sql.functions as psf
import numpy as np
```

First I created a List of all possible Black colours. The street code column was added for the requirements of the question. For which spark vector assembler was used. For the k means value of K is 4. Then a function calculates the probability of a black vehicle being in a cluster by using the list I created. Finally the closest cluster is found using Euclidean Distance, and the closest cluster index is returned.

```
def vectorize_street_codes(data_frame):
```

```
assembler = VectorAssembler(inputCols=["Street Code1", "Street
Code2", "Street Code3"], outputCol="vectorized street codes")
    return assembler.transform(data frame)
def initialize kmeans(vectorized data):
    kmeans model = KMeans(k=4, featuresCol="vectorized street codes")
    model fit =
kmeans model.fit(vectorized data.select('vectorized street codes'))
    cluster centers =
np.array(model fit.clusterCenters()).astype(float)
    return model fit.transform(vectorized data).cache(),
cluster centers
def calculate black car probability(data frame, black colors):
    color distribution = data frame.groupBy('prediction').agg(
        psf.sum(psf.when(psf.col('Vehicle Color').isin(black_colors),
1)).alias('Black Count'),
        psf.count('Vehicle Color').alias('Total Cars')
    ).orderBy('prediction')
    return color distribution.select(
        'prediction',
        'Black Count',
        'Total Cars',
        (psf.col('Black Count') /
psf.col('Total_Cars')).alias('Probability')
def find closest cluster(street data, cluster centers):
    street data = np.array(street data)
    distances = np.sum((cluster centers - street data)**2, axis=1)
    closest cluster index = np.argmin(distances)
    return closest cluster index
def display cluster probability(cluster center id, probabilities df):
    print(f'Cluster ID for given Street Code: {cluster center id}')
print("-----
    print("Probability for that Cluster:")
    probabilities df.filter(psf.col('prediction') ==
cluster center id).show()
```

```
def calculate and display probability(data frame, black colors,
street code):
   vectorized data = vectorize street codes(data frame)
   clustered data, cluster centers =
initialize kmeans(vectorized data)
   probabilities df = calculate black car probability(clustered data,
black_colors)
   closest cluster id = find closest cluster(street code,
cluster centers)
   display cluster probability(closest cluster id, probabilities df)
blackColor=['BLK.', 'Black', 'BC', 'BLAC', 'BK/', 'BLK', 'BK.', 'BCK',
'BK', 'B LAC']
streetCode=[34510, 10030, 34050]
calculate and display probability(QUE1 NYC,blackColor,streetCode )
Cluster ID for given Street Code (34510, 10030, 34050): 0
Probability for that Specific Cluster:
  . - - - - - - + - - - - - - - - + - - - - - - + - - - - - + - - - - - - +
|prediction|Black_Count|Total_Cars| Probability|
+----+
              327327| 2342418|0.13973893643235324|
+----+
```

The above model is built for K = 4 for which probability is 0.1476759875634194

```
spkObj.stop()
```

### **QUESTION 2**

```
spk0bj =
pyspark.sql.SparkSession.builder.appName("vekal_Assignment_2").get0rCr
eate()

spk0bj.conf.set("spark.sql.repl.eagerEval.enabled", True)

QUE2_NBA = spk0bj.read.format("csv").option("header",
"true",).option("inferSchema","true").load('/content/drive/MyDrive/shot_logs.csv')

QUE2_NBA.show(n=1)
```

```
+-----
+-----
        MATCHUP|LOCATION| W|FINAL_MARGIN|SHOT_NUMBER|
| GAME ID|
      GAME_CLOCK|SHOT_CLOCK|DRIBBLES|TOUCH_TIME|SHOT_DIST|
PERIOD|
PTS TYPE|SHOT RESULT|CLOSEST DEFENDER|CLOSEST DEFENDER PLAYER ID|
CLOSE_DEF_DIST|FGM|PTS| player_name|player_id|
+----+------
+-----
|21400899|MAR 04, 2015 - CH...|
             A| W|
                    24
                  1.9|
1|2024-04-12 01:09:00|
        10.8
                      7.71
2|
   made| Anderson, Alan|
                   101187|
1.3 | 1 | 2 | brian roberts | 203148 |
+-----+
only showing top 1 row
```

Number of Rows and Columns

```
print("Total Number of Rows: " , QUE2_NBA.count())
print("Total Number of Columns: " , len(QUE2_NBA.columns))
Total Number of Rows: 128069
Total Number of Columns: 21
```

Schema

```
root
|-- GAME_ID: integer (nullable = true)
|-- MATCHUP: string (nullable = true)
|-- LOCATION: string (nullable = true)
|-- W: string (nullable = true)
|-- FINAL_MARGIN: integer (nullable = true)
|-- SHOT_NUMBER: integer (nullable = true)
|-- PERIOD: integer (nullable = true)
|-- GAME_CLOCK: timestamp (nullable = true)
|-- SHOT_CLOCK: double (nullable = true)
|-- DRIBBLES: integer (nullable = true)
|-- TOUCH_TIME: double (nullable = true)
|-- SHOT_DIST: double (nullable = true)
|-- PTS_TYPE: integer (nullable = true)
```

```
|-- SHOT_RESULT: string (nullable = true)
|-- CLOSEST_DEFENDER: string (nullable = true)
|-- CLOSEST_DEFENDER_PLAYER_ID: integer (nullable = true)
|-- CLOSE_DEF_DIST: double (nullable = true)
|-- FGM: integer (nullable = true)
|-- PTS: integer (nullable = true)
|-- player_name: string (nullable = true)
|-- player_id: integer (nullable = true)
```

For each pair of the players (A, B), we define the fear sore of A when facing B is the hit rate, such that B is closet defender when A is shooting. Based on the fear sore, for each player, please find out who is his "most unwanted defender". (10 pts)

madeCond and missedCond are used to create a separate dataframe. Where we use the player name and closest defender as a pair. Then I calculated a ratio of total shots made and total shots attempted, by usinfg the same pair mentioned above. We drop the null and duplicate values along the way based on Player ID and Defender ID and display the answer.

```
2026871
              201980|
                                   01
     2744|
                1717|
                         01
                                   2|
   203469|
              2023291
                         11
                                   1|
   2019451
              2023221
                         01
                                   31
   2026891
              2026991
                         6 I
                                   81
   202689|
              2039241
                         11
                                   01
                         1|
                                   0|
   203077|
               2730|
   2030771
              2015841
                         21
                                   01
                         2|
   202362|
              201188
only showing top 10 rows
dataframe = dataframe.withColumn(
   "HR",
   psf.col("Scored") / (psf.col("Scored") + psf.col("Not Scored"))
dataframe.show(10)
+----+
|Player ID|Defender ID|Scored|Not Scored|
   203148|
              101179|
                         0 |
                                                    0.0|
                                  0|
   2026871
              201980|
                        1|
                                                    1.01
                1717
                       0 j
                                   2|
     2744|
                                                    0.01
              202329|
   203469|
                        11
                                   1|
                                                    0.51
              202322|
202699|
   201945|
                        0|
                                   31
                                                    0.01
   202689
                         6|
                                   8|0.42857142857142855|
   2026891
              2039241
                        11
                                   0|
                                                    1.0
                        1
   203077|
                2730|
                                   0|
                                                    1.01
              201584|
   203077|
                         2|
                                   0|
                                                    1.0
   202362|
              201188|
                         2|
                                   0|
                                                    1.0|
+----+
only showing top 10 rows
dataframe = dataframe.filter(psf.col("HR").isNotNull())
dataframe = dataframe.dropDuplicates(subset=["Player ID", "HR"])
tempFrame = dataframe.groupBy("Player
ID").agg(psf.min("HR").alias("HR"))
dataframe = dataframe.join(tempFrame, ["Player ID",
"HR"]).select("Player ID", "Defender ID")
dataframe = dataframe.join(
   QUE2 NBA,
   (QUE2 NBA["player id"] == dataframe["Player ID"]) &
(QUE2_NBA["CLOSEST_DEFENDER_PLAYER_ID"] == dataframe["Defender ID"])
```

```
).withColumn("Player Name", col("player_name")).withColumn("Most
Unwanted Defender", col("CLOSEST DEFENDER"))
dataframe = dataframe.dropDuplicates(["Player ID", "Defender ID"])
dataframe.select("Player Name", "Most Unwanted Defender").show(10)
    Player Name | Most Unwanted Defender |
  kevin garnett|
                             Exum, Dante
    kobe bryant|
tim duncan|
                        Anderson, Kyle
   vince carter|
.rk nowtizski
                         Roberts, Brian
                         Crawford, Jamal|
 dirk nowtizskil
                             Hickson, JJ|
    paul pierce|
                           Waiters, Dion|
   andre miller | Splitter, Tiago | Shawn marion | Tolliver, Anthony
 manu ginobili| Benn
                            Lopez, Brook
                       Bennett, Anthonyl
only showing top 10 rows
```

#### **Answer:**

From the above table, we can see that most unwanted defender for each of the player. So, if Kevin Garnett is the shooter, the most the unwanted defender is the Exum, Dante

```
spkObj.stop()
```

# For each player, we define the comfortable zone of shooting is a matrix of,

# {SHOT DIST, CLOSE DEF DIST, SHOT CLOCK}

# Please develop a Spark-based algorithm to classify each player's records into 4 comfortable zones. Considering the hit rate, which zone is the best for James Harden, Chris Paul, Stephen Curry, and Lebron James. (10 pts)

```
spk0bj=
pyspark.sql.SparkSession.builder.appName("vekal_Assignment_2").get0rCr
eate()
spk0bj.conf.set("spark.sql.repl.eagerEval.enabled", True)
```

```
QUE2_NBA = spk0bj.read.format("csv").option("header",
"true",).option("inferSchema","true").load('/content/drive/MyDrive/
shot_logs.csv').select("player_name","SHOT_DIST","CLOSE_DEF_DIST",
"SHOT_CLOCK", "SHOT_RESULT").na.drop()
```

Transforming the column into binary 1 for successful shot 0 for missed. (Basically One-Hot Encoding)

```
QUE2_NBA = QUE2_NBA.withColumn('SHOT_RESULT',
psf.when(psf.col('SHOT_RESULT') == 'made',
1).otherwise(0).cast('float'))
comfortMatrix = ["SHOT_DIST", "CLOSE_DEF_DIST", "SHOT_CLOCK"]
```

Chnaging every column data type to float.

```
for i in comfortMatrix:
   QUE2_NBA = QUE2_NBA.withColumn(i, psf.col(i).cast("float"))
```

The value of K is 4, and we fit the model to the data. The data is filtered for the required player. The fitted model is then used to predict the cluster assignment. Since the K means clustering algorithm assigns clusters randomly every time we run the code we might get different clusters. But few players will belong to the same cluster only. In this example except for Chris Paul, everyone else will be in the same zone.

```
vecAssembler = VectorAssembler(inputCols=comfortMatrix,
outputCol="Zones")
QUE2_NBA = vecAssembler.transform(QUE2_NBA).select('player_name',
'Zones', 'SHOT_RESULT')

kmeans = KMeans(k=4, featuresCol="Zones")
kmeansFitData = kmeans.fit(QUE2_NBA)

pD = QUE2_NBA.filter(QUE2_NBA['player_name'].isin(['james harden',
'chris paul', 'stephen curry', 'lebron james']))

pred = kmeansFitData.transform(pD).select('player_name', 'prediction',
'SHOT_RESULT')
```

Following code snippet basically calculates the average shot result for every player. Then max avg shot result for each player is identified using join operation. Only where the avg is highest.

```
pred.createOrReplaceTempView("player_zones")

result = spk0bj.sql("""SELECT player_name, prediction,
AVG(SHOT_RESULT) AS avgShotResult FROM player_zones GROUP BY
player_name, prediction ORDER BY player_name, prediction """)
```

#### Answer:

Zone-1 corresponds to a prediction value of 0, Zone-2 to 1, Zone-3 to 2, and Zone-4 to 3 in the 'prediction' column of the dataset. To analyze each player's comfort zone, the data was organized by player and by zone, and the average score was computed for each grouping.

```
spkObj.stop()
```