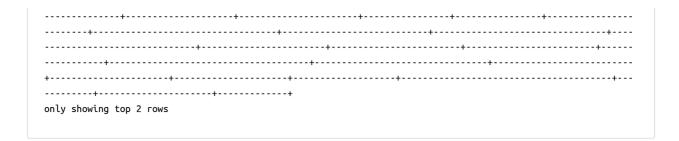
## /PySpark/Py\_spark...

# READY Modeling on Malware Data Using PySpark. Importing required libraries READY %pyspark READY from pyspark.sql import SparkSession #sqlContext = SQLContext(sc) Reading Malware data from HDFS READY %pyspark data = spark.read.csv('hdfs://172.27.35.78:9000/MicrosoftMalware.csv',header=True, inferSchema=True) View data using "show" command READY %pyspark READY data.show(2,True) MachineIdentifier | ProductName | EngineVersion | AppVersion|AvSigVersion|IsBeta|RtpStateBitfield|IsS xsPassiveMode|AVProductStatesIdentifier|AVProductsInstalled|AVProductsEnabled|HasTpm|CountryIdentifier|CityId entifier|OrganizationIdentifier|GeoNameIdentifier|LocaleEnglishNameIdentifier| Platform|Processor| OsBuildLab|SkuEdition|IsProtected|AutoSampleOptIn|SMode|IeVerIde Build|OsSuite|OsPlatformSubRelease| $ntifier \mid SmartScreen \mid Firewall \mid UacLuaenable \mid Census\_MDC2FormFactor \mid Census\_DeviceFamily \mid Census\_OEMNameIdentifier \mid Census\_DeviceFamily \mid Census\_DEMNameIdentifier \mid Census\_DeviceFamily \mid Cens$ $| {\tt Census\_DEMModelIdentifier}| {\tt Census\_ProcessorCoreCount}| {\tt Census\_ProcessorManufacturerIdentifier}| {\tt Census\_ProcessorManufacturerIdentifier}|$ odelIdentifier|Census\_PrimaryDiskTotalCapacity|Census\_PrimaryDiskTypeName|Census\_SystemVolumeTotalCapacity|Ce nsus\_HasOpticalDiskDrive|Census\_TotalPhysicalRAM|Census\_ChassisTypeName|Census\_InternalPrimaryDiagonalDisplay

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#### Printing the Schema of the features

**READY** 

```
%pyspark
                                                                                                      READY
data.printSchema()
|-- c0: integer (nullable = true)
|-- MachineIdentifier: string (nullable = true)
|-- ProductName: string (nullable = true)
|-- EngineVersion: string (nullable = true)
|-- AppVersion: string (nullable = true)
|-- AvSigVersion: string (nullable = true)
|-- IsBeta: integer (nullable = true)
|-- RtpStateBitfield: double (nullable = true)
|-- IsSxsPassiveMode: integer (nullable = true)
|-- AVProductStatesIdentifier: double (nullable = true)
|-- AVProductsInstalled: double (nullable = true)
|-- AVProductsEnabled: double (nullable = true)
|-- HasTpm: integer (nullable = true)
|-- CountryIdentifier: integer (nullable = true)
|-- CityIdentifier: double (nullable = true)
|-- OrganizationIdentifier: double (nullable = true)
|-- GeoNameIdentifier: double (nullable = true)
|-- LocaleEnglishNameIdentifier: integer (nullable = true)
|-- Platform: string (nullable = true)
|-- Processor: string (nullable = true)
|-- OsVer: string (nullable = true)
|-- OsBuild: integer (nullable = true)
|-- OsSuite: integer (nullable = true)
|-- OsPlatformSubRelease: string (nullable = true)
|-- OsBuildLab: string (nullable = true)
|-- SkuEdition: string (nullable = true)
|-- IsProtected: double (nullable = true)
|-- AutoSampleOptIn: integer (nullable = true)
I-- SMode: double (nullable = true)
|-- IeVerIdentifier: double (nullable = true)
|-- SmartScreen: string (nullable = true)
|-- Firewall: double (nullable = true)
|-- UacLuaenable: double (nullable = true)
|-- Census_MDC2FormFactor: string (nullable = true)
|-- Census_DeviceFamily: string (nullable = true)
|-- Census_OEMNameIdentifier: double (nullable = true)
|-- Census_OEMModelIdentifier: double (nullable = true)
|-- Census_ProcessorCoreCount: double (nullable = true)
|-- Census_ProcessorManufacturerIdentifier: double (nullable = true)
|-- Census_ProcessorModelIdentifier: double (nullable = true)
|-- Census_PrimaryDiskTotalCapacity: double (nullable = true)
|-- Census PrimaryDiskTypeName: string (nullable = true)
|-- Census_SystemVolumeTotalCapacity: double (nullable = true)
|-- Census_HasOpticalDiskDrive: integer (nullable = true)
```

```
|-- Census_TotalPhysicalRAM: double (nullable = true)
|-- Census_ChassisTypeName: string (nullable = true)
|-- Census_InternalPrimaryDiagonalDisplaySizeInInches: double (nullable = true)
|-- Census InternalPrimaryDisplayResolutionHorizontal: double (nullable = true)
|-- Census_InternalPrimaryDisplayResolutionVertical: double (nullable = true)
|-- Census PowerPlatformRoleName: string (nullable = true)
|-- Census InternalBatteryNumberOfCharges: double (nullable = true)
|-- Census_OSVersion: string (nullable = true)
|-- Census_OSArchitecture: string (nullable = true)
|-- Census_OSBranch: string (nullable = true)
|-- Census_OSBuildNumber: integer (nullable = true)
|-- Census_OSBuildRevision: integer (nullable = true)
|-- Census_OSEdition: string (nullable = true)
|-- Census_OSSkuName: string (nullable = true)
|-- Census_OSInstallTypeName: string (nullable = true)
|-- Census OSInstallLanguageIdentifier: double (nullable = true)
|-- Census_OSUILocaleIdentifier: integer (nullable = true)
```

#### view the datatype of our DataFrame.

**READY** 

%pyspark
type(data)
<class 'pyspark.sql.dataframe.DataFrame'>

#### Description of the data.

**READY** 

%pyspark READY data.describe()

DataFrame[summary: string, \_c0: string, MachineIdentifier: string, ProductName: string, EngineVersion: string , AppVersion: string, AvSigVersion: string, IsBeta: string, RtpStateBitfield: string, IsSxsPassiveMode: strin g, AVProductStatesIdentifier: string, AVProductsInstalled: string, AVProductsEnabled: string, HasTpm: string, CountryIdentifier: string, CityIdentifier: string, OrganizationIdentifier: string, GeoNameIdentifier: string, LocaleEnglishNameIdentifier: string, Platform: string, Processor: string, OsVer: string, OsBuild: string, OsS uite: string, OsPlatformSubRelease: string, OsBuildLab: string, SkuEdition: string, IsProtected: string, Auto SampleOptIn: string, SMode: string, IeVerIdentifier: string, SmartScreen: string, Firewall: string, UacLuaena ble: string, Census\_MDC2FormFactor: string, Census\_DeviceFamily: string, Census\_OEMNameIdentifier: string, Ce nsus\_OEMModelIdentifier: string, Census\_ProcessorCoreCount: string, Census\_ProcessorManufacturerIdentifier: s tring, Census\_ProcessorModelIdentifier: string, Census\_PrimaryDiskTotalCapacity: string, Census\_PrimaryDiskTy peName: string, Census\_SystemVolumeTotalCapacity: string, Census\_HasOpticalDiskDrive: string, Census\_TotalPhy sicalRAM: string, Census\_ChassisTypeName: string, Census\_InternalPrimaryDiagonalDisplaySizeInInches: string, Census\_InternalPrimaryDisplayResolutionHorizontal: string, Census\_InternalPrimaryDisplayResolutionVertical: s tring, Census PowerPlatformRoleName: string, Census InternalBatteryNumberOfCharges: string, Census OSVersion: string, Census\_OSArchitecture: string, Census\_OSBranch: string, Census\_OSBuildNumber: string, Census\_OSBuildR evision: string, Census\_OSEdition: string, Census\_OSSkuName: string, Census\_OSInstallTypeName: string, Census \_OSInstallLanguageIdentifier: string, Census\_OSUILocaleIdentifier: string, Census\_OSWUAutoUpdateOptionsName:

#### Get the columns of the DataFrame.

READY

MNVSDark DEADV

['\_c0', 'MachineIdentifier', 'ProductName', 'EngineVersion', 'AppVersion', 'AvSigVersion', 'IsBeta', 'RtpStat eBitfield', 'IsSxsPassiveMode', 'AVProductStatesIdentifier', 'AVProductsInstalled', 'AVProductsEnabled', 'HassiveMode', 'AVProductsInstalled', 'AVProductsInstTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNam eIdentifier', 'Platform', 'Processor', 'OsVer', 'OsBuild', 'OsSuite', 'OsPlatformSubRelease', 'OsBuildLab', ' SkuEdition', 'IsProtected', 'AutoSampleOptIn', 'SMode', 'IeVerIdentifier', 'SmartScreen', 'Firewall', 'UacLua enable', 'Census\_MDC2FormFactor', 'Census\_DeviceFamily', 'Census\_OEMNameIdentifier', 'Census\_OEMModelIdentifi er', 'Census ProcessorCoreCount', 'Census ProcessorManufacturerIdentifier', 'Census ProcessorModelIdentifier' , 'Census PrimaryDiskTotalCapacity', 'Census PrimaryDiskTypeName', 'Census SystemVolumeTotalCapacity', 'Census s HasOpticalDiskDrive', 'Census TotalPhysicalRAM', 'Census ChassisTypeName', 'Census InternalPrimaryDiagonalD isplaySizeInInches', 'Census\_InternalPrimaryDisplayResolutionHorizontal', 'Census\_InternalPrimaryDisplayResol utionVertical', 'Census\_PowerPlatformRoleName', 'Census\_InternalBatteryNumberOfCharges', 'Census\_OSVersion', 'Census\_OSArchitecture', 'Census\_OSBranch', 'Census\_OSBuildNumber', 'Census\_OSBuildRevision', 'Census\_OSEditi  $\verb"on', 'Census_OSSkuName', 'Census_OSInstallTypeName', 'Census_OSInstallLanguageIdentifier', 'Census_OSUILocale' and the property of the pro$ Identifier', 'Census\_OSWUAutoUpdateOptionsName', 'Census\_IsPortableOperatingSystem', 'Census\_GenuineStateName ', 'Census\_ActivationChannel', 'Census\_IsFlightsDisabled', 'Census\_FlightRing', 'Census\_FirmwareManufacturerI dentifier', 'Census\_FirmwareVersionIdentifier', 'Census\_IsSecureBootEnabled', 'Census\_IsVirtualDevice', 'Census\_IsVirtualD  $us\_IsTouch Enabled', 'Census\_IsPenCapable', 'Census\_IsAlwaysOnAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RaysConnectedCapable', 'Census\_IsAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RaysConnectedCapable', 'Wd$ 

#### Viewing the distribution of the target variable.

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READY

```
#%pvspark
                                                                                                      READY
 # from matplotlib import pyplot as plt
 #import numpy as np
 #import functools
 # #matplotlib inline
 # responses = data.groupBy('HasDetections').count().collect()
 # categories = [i[0] for i in responses]
 # counts = [i[1] for i in responses]
 # ind = np.array(range(len(categories)))
 # width = 0.30
 # plt.bar(ind, counts, width=width, color='r')
 # plt.ylabel('counts')
 # plt.title('Response distribution')
 # plt.xticks(ind + width/2., categories)
([<matplotlib.axis.XTick object at 0x7f41b56e5048>, <matplotlib.axis.XTick object at 0x7f41b543ac50>], <a lis
```

Response distribution

1600000 1400000 1000000 800000 600000 400000 -



#### Printing the count of a target classes.

READY

```
%pyspark
# print(responses)
# print(categories)
# print(counts)

[Row(HasDetections=1, count=1689470), Row(HasDetections=0, count=1570254)]
[1, 0]
[1689470, 1570254]
```

#### Droping the Features.

**READY** 

```
READY
 data = data.drop('_c0', 'MachineIdentifier', 'AvSigVersion')
 data.columns
['ProductName', 'EngineVersion', 'AppVersion', 'IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductSt
atesIdentifier', 'AVProductsInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier',
'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNameIdentifier', 'Platform', 'Processor', 'OsVer
', 'OsBuild', 'OsSuite', 'OsPlatformSubRelease', 'OsBuildLab', 'SkuEdition', 'IsProtected', 'AutoSampleOptIn'
, 'SMode', 'IeVerIdentifier', 'SmartScreen', 'Firewall', 'UacLuaenable', 'Census_MDC2FormFactor', 'Census_Dev
iceFamily', 'Census_OEMNameIdentifier', 'Census_OEMModelIdentifier', 'Census_ProcessorCoreCount', 'Census_Pro
cessorManufacturerIdentifier', 'Census_ProcessorModelIdentifier', 'Census_PrimaryDiskTotalCapacity', 'Census_
PrimaryDiskTypeName', 'Census_SystemVolumeTotalCapacity', 'Census_HasOpticalDiskDrive', 'Census_TotalPhysical
RAM', 'Census_ChassisTypeName', 'Census_InternalPrimaryDiagonalDisplaySizeInInches', 'Census_InternalPrimaryD
isplayResolutionHorizontal', 'Census_InternalPrimaryDisplayResolutionVertical', 'Census_PowerPlatformRoleName
 ', 'Census_InternalBatteryNumberOfCharges', 'Census_OSVersion', 'Census_OSArchitecture', 'Census_OSBranch', '
Census_OSBuildNumber', 'Census_OSBuildRevision', 'Census_OSEdition', 'Census_OSSkuName', 'Census_OSInstallTyp
eName', 'Census_OSInstallLanguageIdentifier', 'Census_OSUILocaleIdentifier', 'Census_OSWUAutoUpdateOptionsNam
e', 'Census_IsPortableOperatingSystem', 'Census_GenuineStateName', 'Census_ActivationChannel', 'Census_IsFlig
htsDisabled', 'Census_FlightRing', 'Census_FirmwareManufacturerIdentifier', 'Census_FirmwareVersionIdentifier
', 'Census_IsSecureBootEnabled', 'Census_IsVirtualDevice', 'Census_IsTouchEnabled', 'Census_IsPenCapable', 'C
ensus\_IsAlwaysOnAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RegionIdentifier', 'HasDetections']
```

#### Printing the count of a categorical and numerical features.

READY

```
%pyspark
# now let's see how many categorical and numerical features we have:
catcolumns = [item[0] for item in data.dtypes if item[1].startswith('string')]
print(str(len(catcolumns)) + ' categorical features')
numcolumns = [item[0] for item in data.dtypes if item[1].startswith('int') | item[1].startswith('double')][::
print(str(len(numcolumns)) + ' numerical features')
26 categorical features
48 numerical features
```

#### Printing categorical columns.

READY

%pyspark
#categorical columns
catcolumns=[item[0] for item in data.dtypes if item[1].startswith('string')] #will select name of column wit
print("cateogrical columns: ", catcolumns)

cateogrical columns: ['ProductName', 'EngineVersion', 'AppVersion', 'Platform', 'Processor', 'OsVer', 'OsPlat
formSubRelease', 'OsBuildLab', 'SkuEdition', 'SmartScreen', 'Census\_MDC2FormFactor', 'Census\_DeviceFamily', '
Census\_PrimaryDiskTypeName', 'Census\_ChassisTypeName', 'Census\_PowerPlatformRoleName', 'Census\_OSVersion', 'C
ensus\_OSArchitecture', 'Census\_OSBranch', 'Census\_OSEdition', 'Census\_OSSkuName', 'Census\_OSInstallTypeName',
'Census\_OSWUAutoUpdateOptionsName', 'Census\_GenuineStateName', 'Census\_ActivationChannel', 'Census\_FlightRing
']

#### Printing numeric columns.

READY

%pyspark
### numerical columns
numcolumns = [item[0] for item in data.dtypes if item[1].startswith('int') | item[1].startswith('double')] #v
 or double data type
print("numerical columns:", numcolumns)
numerical columns: ['IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductStatesIdentifier', 'AVProduct
sInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier',

numerical columns: ['IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductStatesIdentifier', 'AVProduct sInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNameIdentifier', 'OsBuild', 'OsSuite', 'IsProtected', 'AutoSampleOptIn', 'SMode', 'IeVerIdentifier', 'Firewall', 'UacLuaenable', 'Census\_OEMNameIdentifier', 'Census\_OEMModelIdentifier', 'Census\_ProcessorCoreCount', 'Census\_ProcessorManufacturerIdentifier', 'Census\_ProcessorModelIdentifier', 'Census\_PrimaryDiskTotalCapacity', 'Census\_ProcessorModelIdentifier', 'Census\_PrimaryDiskTotalCapacity', 'Census\_HasOpticalDiskDrive', 'Census\_TotalPhysicalRAM', 'Census\_InternalPrimaryDiagonalDisplaySizeInInches', 'Census\_InternalPrimaryDisplayResolutionHorizontal', 'Census\_InternalPrimaryDisplayResolutionVertical', 'Census\_InternalBatteryNumberOfCharges', 'Census\_OSBuildNumber', 'Census\_OSBuildRevision', 'Census\_OSInstalLanguageIdentifier', 'Census\_OSUILocaleIdentifier', 'Census\_IsPortableOperatingSystem', 'Census\_IsFlightsDisabled', 'Census\_IsrmwareManufacturerIdentifier', 'Census\_IsFirmwareVersionIdentifier', 'Census\_IsSecureBootEnabled', 'Census\_IsVirtualDevice', 'Census\_IsTo uchEnabled', 'Census\_IsPenCapable', 'Census\_IsAlwaysOnAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RegionIdentifier', 'HasDetections']

#### Verifying the type of a numeric columns

**READY** 

%pyspark
type(numcolumns)
<class 'list'>

#### Selecting categorical columns

READY

<pre>%pyspark categorical = data.sel categorical.show()</pre>	ect(catcolumns)	READY
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us_OSEdition	-		ne Census_OSWUAutoUpdateC	OptionsName Census_GenuineSta
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```

#### Checking the unique values in each categorical columns

**READY** 

```
%pvspark
                                                                                                             READY
 for i in categorical:
     print(i,(categorical.select(i).distinct().count()))
Column<br/>b'ProductName'> 2
Column<br/>b'EngineVersion'> 57
Column<br/>
b'AppVersion'> 101
Column<br/>b'AvSigVersion'> 6856
Column<br/>b'Platform'> 3
Column<h'Processor'> 3
Column<br/>b'OsVer'> 33
Column<br/>b'OsPlatformSubRelease'> 9
Column<br/>b'OsBuildLab'> 418
Column<br/>b'SkuEdition'> 7
Column<br/>b'SmartScreen'> 16
Column<br/>b'Census MDC2FormFactor'> 11
Column<br/>b'Census_DeviceFamily'> 3
Column<b'Census_PrimaryDiskTypeName'> 4
Column<br/>clumn<br/>Census_ChassisTypeName'> 40
Column<br/>b'Census PowerPlatformRoleName'> 9
Column<br/>o'Census OSVersion'> 359
```

#### Importing modules for data preprocessing

READY

```
%pyspark
from pyspark.ml.feature import StringIndexer, VectorAssembler
from pyspark.ml.feature import OneHotEncoder
```

#### Applying one-hot encoding to the categorical columns

READY

```
%pyspark stages = []
```

```
%pyspark
                                                                                                READY
 #data.select('f1', 'f2').show
                                  #for showing features from the dataframe
                                                                                                READY
 assemblerInputs = [c + "_classVec" for c in catcolumns] + numcolumns
 assemblerr = VectorAssembler(inputCols=assemblerInputs, outputCol="features")
 #data_cp = assemblerr.transform(data_cp)
 stages += [assemblerr]
 %pyspark
                                                                                                READY
 from pyspark.ml.feature import MinMaxScaler
 scaler = MinMaxScaler(inputCol="features", outputCol="scaledFeatures")
 stages += [scaler]
if you have target feature as categories then only You have to perform this other wise
escape this
                                                                                               READY
```

# Convert label into label indices using the StringIndexer

#stages += [label\_stringIdx]

#label\_stringIdx = StringIndexer(inputCol="HasDetections", outputCol="label")

%pyspark data.columns READY

['ProductName', 'EngineVersion', 'AppVersion', 'IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductSt atesIdentifier', 'AVProductsInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNameIdentifier', 'Platform', 'Processor', 'OsVer ', 'OsBuild', 'OsSuite', 'OsPlatformSubRelease', 'OsBuildLab', 'SkuEdition', 'IsProtected', 'AutoSampleOptIn' 'SMode', 'IeVerIdentifier', 'SmartScreen', 'Firewall', 'UacLuaenable', 'Census\_MDC2FormFactor', 'Census\_Dev iceFamily', 'Census\_OEMNameIdentifier', 'Census\_OEMModelIdentifier', 'Census\_ProcessorCoreCount', 'Census\_Pro cessorManufacturerIdentifier', 'Census\_ProcessorModelIdentifier', 'Census\_PrimaryDiskTotalCapacity', 'Census\_ PrimaryDiskTypeName', 'Census SystemVolumeTotalCapacity', 'Census HasOpticalDiskDrive', 'Census TotalPhysical RAM', 'Census ChassisTypeName', 'Census InternalPrimaryDiagonalDisplaySizeInInches', 'Census InternalPrimaryD isplayResolutionHorizontal', 'Census InternalPrimaryDisplayResolutionVertical', 'Census PowerPlatformRoleName ', 'Census\_InternalBatteryNumberOfCharges', 'Census\_OSVersion', 'Census\_OSArchitecture', 'Census\_OSBranch', Census\_OSBuildNumber', 'Census\_OSBuildRevision', 'Census\_OSEdition', 'Census\_OSSkuName', 'Census\_OSInstallTyp eName', 'Census\_OSInstallLanguageIdentifier', 'Census\_OSUILocaleIdentifier', 'Census\_OSWUAutoUpdateOptionsNam e', 'Census\_IsPortableOperatingSystem', 'Census\_GenuineStateName', 'Census\_ActivationChannel', 'Census\_IsFlig htsDisabled', 'Census\_FlightRing', 'Census\_FirmwareManufacturerIdentifier', 'Census\_FirmwareVersionIdentifier ', 'Census\_IsSecureBootEnabled', 'Census\_IsVirtualDevice', 'Census\_IsTouchEnabled', 'Census\_IsPenCapable', 'C ensus IsAlwaysOnAlwaysConnectedCapable', 'Wdft IsGamer', 'Wdft RegionIdentifier', 'HasDetections']

#### **Executing Pipeline**

READY

%pyspark from pyspark.ml import Pipeline RFADY

partialPipeline = Pipeline().setStages(stages)
pipeline\_data = partialPipeline.fit(data).transform(data)

%pyspark
pipeline\_data.columns

READY

['ProductName', 'EngineVersion', 'AppVersion', 'IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductSt atesIdentifier', 'AVProductsInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNameIdentifier', 'Platform', 'Processor', 'OsVer ', 'OsBuild', 'OsSuite', 'OsPlatformSubRelease', 'OsBuildLab', 'SkuEdition', 'IsProtected', 'AutoSampleOptIn' . 'SMode', 'IeVerIdentifier', 'SmartScreen', 'Firewall', 'UacLuaenable', 'Census\_MDC2FormFactor', 'Census\_Dev iceFamily', 'Census\_OEMNameIdentifier', 'Census\_OEMModelIdentifier', 'Census\_ProcessorCoreCount', 'Census\_Pro cessorManufacturerIdentifier', 'Census\_ProcessorModelIdentifier', 'Census\_PrimaryDiskTotalCapacity', 'Census\_ PrimaryDiskTypeName', 'Census\_SystemVolumeTotalCapacity', 'Census\_HasOpticalDiskDrive', 'Census\_TotalPhysical RAM', 'Census\_ChassisTypeName', 'Census\_InternalPrimaryDiagonalDisplaySizeInInches', 'Census\_InternalPrimaryD isplayResolutionHorizontal', 'Census\_InternalPrimaryDisplayResolutionVertical', 'Census\_PowerPlatformRoleName ', 'Census\_InternalBatteryNumberOfCharges', 'Census\_OSVersion', 'Census\_OSArchitecture', 'Census\_OSBranch', ' Census\_OSBuildNumber', 'Census\_OSBuildRevision', 'Census\_OSEdition', 'Census\_OSSkuName', 'Census\_OSInstallTyp eName', 'Census\_OSInstallLanguageIdentifier', 'Census\_OSUILocaleIdentifier', 'Census\_OSWUAutoUpdateOptionsNam e', 'Census\_IsPortableOperatingSystem', 'Census\_GenuineStateName', 'Census\_ActivationChannel', 'Census\_IsFlig htsDisabled', 'Census\_FlightRing', 'Census\_FirmwareManufacturerIdentifier', 'Census\_FirmwareVersionIdentifier ', 'Census\_IsSecureBootEnabled', 'Census\_IsVirtualDevice', 'Census\_IsTouchEnabled', 'Census\_IsPenCapable', 'C ensus\_IsAlwaysOnAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RegionIdentifier', 'HasDetections', 'ProductNa me\_Index', 'ProductName\_classVec', 'EngineVersion\_Index', 'EngineVersion\_classVec', 'AppVersion\_Index', 'AppV ersion\_classVec', 'Platform\_Index', 'Platform\_classVec', 'Processor\_Index', 'Processor\_classVec', 'OsVer\_Inde x', 'OsVer\_classVec', 'OsPlatformSubRelease\_Index', 'OsPlatformSubRelease\_classVec', 'OsBuildLab\_Index', 'OsB uildLab\_classVec', 'SkuEdition\_Index', 'SkuEdition\_classVec', 'SmartScreen\_Index', 'SmartScreen\_classVec', 'C ensus\_MDC2FormFactor\_Index', 'Census\_MDC2FormFactor\_classVec', 'Census\_DeviceFamily\_Index', 'Census\_DeviceFam ily\_classVec', 'Census\_PrimaryDiskTypeName\_Index', 'Census\_PrimaryDiskTypeName\_classVec', 'Census\_ChassisType Name\_Index', 'Census\_ChassisTypeName\_classVec', 'Census\_PowerPlatformRoleName\_Index', 'Census\_PowerPlatformRo

leName\_classVec', 'Census\_OSVersion\_Index', 'Census\_OSVersion\_classVec', 'Census\_OSArchitecture\_Index', 'Census\_OSVersion\_classVec', 'Census\_OSArchitecture\_Index', 'Census\_OSVersion\_classVec', 'Census\_OSVec', 'Cen us\_OSArchitecture\_classVec', 'Census\_OSBranch\_Index', 'Census\_OSBranch\_classVec', 'Census\_OSEdition\_Index', ' Census\_OSEdition\_classVec', 'Census\_OSSkuName\_Index', 'Census\_OSSkuName\_classVec', 'Census\_OSInstallTypeName\_ Index', 'Census\_OSInstallTypeName\_classVec', 'Census\_OSWUAutoUpdateOptionsName\_Index', 'Census\_OSWUAutoUpdate OptionsName\_classVec', 'Census\_GenuineStateName\_Index', 'Census\_GenuineStateName\_classVec', 'Census\_Activatio nChannel\_Index', 'Census\_ActivationChannel\_classVec', 'Census\_FlightRing\_Index', 'Census\_FlightRing\_classVec' , 'features', 'scaledFeatures']

<pre>%pyspark pipeline_data = pipeline_data.withColumnRenamed('HasDetections','label')</pre>	READY
%pyspark pipeline_data.select('scaledFeatures').show(1,False)	READY
+	

+
scaledFeatures
<u> </u>
+
$\begin{bmatrix} [1.0,1.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0,$

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#### Splitting the data into train and test data.

**READY** 

```
%pyspark
(trainingData, testData) = pipeline_data.randomSplit([0.7, 0.3], seed=100)
print(trainingData.count())
print(testData.count())

2283241
976483
```

```
%pyspark
trainingData.groupBy('label').count().show()

+----+
| HasDetections| count|
+-----+
| 1|1183829|
| 0|1099412|
+-----+
```

%pyspark trainingData.columns READY

['ProductName', 'EngineVersion', 'AppVersion', 'IsBeta', 'RtpStateBitfield', 'IsSxsPassiveMode', 'AVProductSt atesIdentifier', 'AVProductsInstalled', 'AVProductsEnabled', 'HasTpm', 'CountryIdentifier', 'CityIdentifier', 'OrganizationIdentifier', 'GeoNameIdentifier', 'LocaleEnglishNameIdentifier', 'Platform', 'Processor', 'OsVer', 'OsBuild', 'OsSuite', 'OsPlatformSubRelease', 'OsBuildLab', 'SkuEdition', 'IsProtected', 'AutoSampleOptIn', 'SMode', 'IeVerIdentifier', 'SmartScreen', 'Firewall', 'UacLuaenable', 'Census\_MDC2FormFactor', 'Census\_DeviceFamily', 'Census\_OEMNameIdentifier', 'Census\_OEMModelIdentifier', 'Census\_ProcessorCoreCount', 'Census\_ProcessorManufacturerIdentifier', 'Census\_ProcessorModelIdentifier', 'Census\_PrimaryDiskTotalCapacity', 'Census\_PrimaryDiskTypeName', 'Census\_SystemVolumeTotalCapacity', 'Census\_HasOpticalDiskDrive', 'Census\_TotalPhysical RAM', 'Census\_ChassisTypeName', 'Census\_InternalPrimaryDiagonalDisplaySizeInInches', 'Census\_InternalPrimaryDisplayResolutionHorizontal', 'Census\_InternalPrimaryDisplayResolutionVertical', 'Census\_PowerPlatformRoleName', 'Census\_InternalBatteryNumberOfCharges', 'Census\_OSVersion', 'Census\_OSArchitecture', 'Census\_OSBranch', 'Census\_OSBuildNumber', 'Census\_OSBuildRevision', 'Census\_OSEdition', 'Census\_OSSkuName', 'Census\_OSInstallTypeName', 'Census\_OSInstallLanguageIdentifier', 'Census\_OSUILocaleIdentifier', 'Census\_OSWUAutoUpdateOptionsName', 'Census\_IsPortableOperatingSystem', 'Census\_GenuineStateName', 'Census\_ActivationChannel', 'Census\_IsFlightsDisabled', 'Census\_FlightRing', 'Census\_FirmwareManufacturerIdentifier', 'Census\_FirmwareVersionIdentifier'

', 'Census\_IsSecureBootEnabled', 'Census\_IsVirtualDevice', 'Census\_IsTouchEnabled', 'Census\_IsPenCapable', 'C ensus\_IsAlwaysOnAlwaysConnectedCapable', 'Wdft\_IsGamer', 'Wdft\_RegionIdentifier', 'label', 'ProductName\_Index ', 'ProductName\_classVec', 'EngineVersion\_Index', 'EngineVersion\_classVec', 'AppVersion\_Index', 'AppVersion\_c lassVec', 'Platform Index', 'Platform classVec', 'Processor Index', 'Processor classVec', 'OsVer Index', 'OsV er\_classVec', 'OsPlatformSubRelease\_Index', 'OsPlatformSubRelease\_classVec', 'OsBuildLab\_Index', 'OsBuildLab\_ classVec', 'SkuEdition\_Index', 'SkuEdition\_classVec', 'SmartScreen\_Index', 'SmartScreen\_classVec', 'Census\_MD C2FormFactor\_Index', 'Census\_MDC2FormFactor\_classVec', 'Census\_DeviceFamily\_Index', 'Census\_DeviceFamily\_clas  $sVec', 'Census\_PrimaryDiskTypeName\_Index', 'Census\_PrimaryDiskTypeName\_classVec', 'Census\_ChassisTypeName\_Index', 'Census\_PrimaryDiskTypeName\_Index', 'Census\_PrimaryDiskTyp$ lassVec', 'Census\_OSVersion\_Index', 'Census\_OSVersion\_classVec', 'Census\_OSArchitecture\_Index', 'Census\_OSArc hitecture\_classVec', 'Census\_OSBranch\_Index', 'Census\_OSBranch\_classVec', 'Census\_OSEdition\_Index', 'Census\_O  $SEdition\_classVec', 'Census\_OSSkuName\_Index', 'Census\_OSSkuName\_classVec', 'Census\_OSInstallTypeName\_Index', 'Census\_OSSkuName\_Index', 'Census\_OSS$ 'Census\_OSInstallTypeName\_classVec', 'Census\_OSWUAutoUpdateOptionsName\_Index', 'Census\_OSWUAutoUpdateOptionsN ame\_classVec', 'Census\_GenuineStateName\_Index', 'Census\_GenuineStateName\_classVec', 'Census\_ActivationChannel \_Index', 'Census\_ActivationChannel\_classVec', 'Census\_FlightRing\_Index', 'Census\_FlightRing\_classVec', 'featu res', 'scaledFeatures']

```
%pyspark
testData.groupBy('label').count().show()

+-----+
| HasDetections| count|
+----+
| 1|505709|
| 0|471735|
+-----+
```

```
%pyspark
print(trainingData.count(),len(trainingData.dtypes))
print(testData.count(),len(testData.dtypes))
#print(trainingData.columns,testData.columns)

2282280 128
977444 128
```

## Model building starts here.

READY

Applying Logistic Regression.

READY

```
%pyspark
from pyspark.ml.classification import LogisticRegression

# Create initial LogisticRegression model
lr = LogisticRegression(labelCol="label", featuresCol="scaledFeatures", maxIter=10)

# Train model with Training Data
Model = lr.fit(trainingData)

train_prediction = Model.transform(trainingData)

test_prediction = Model.transform(testData)
```

#### Evaluating the model performance.

**READY** 

```
%pyspark
from pyspark.ml.evaluation import MulticlassClassificationEvaluator

evaluator = MulticlassClassificationEvaluator(labelCol="label", predictionCol="prediction", metricName="accur train_accuracy = evaluator.evaluate(train_prediction)
test_accuracy = evaluator.evaluate(test_prediction)
print("Accuracy of LogisticRegression on train is = %g"% (train_accuracy))
print("Accuracy of LogisticRegression on test is = %g"% (test_accuracy))
#print("Test Error of LogisticRegression = %g " % (1.0 - lr_accuracy_test))

Accuracy of LogisticRegression on train is = 0.9261
Accuracy of LogisticRegression on test is = 0.925656
```

### Confusion Matrix. READY

```
%pyspark

TP = cm["1"][0]
FP = cm["0"][0]
TN = cm["0"][1]
FN = cm["1"][1]
print(TP,FP,TN,FN)

476109 42802 427778 29794
```

#### Calculating LR model Accuracy, Sensitivity, Specificity, Precision.

READY

```
%pyspark

Accuracy = (TP+TN)/(TP+TN+FP+FN)
Sensitivity = TP/(TP+FN)
Specificity = TN/(TN+FP)
Precision = TP/(TP+FP)
Print(LACCURACY = NO 251 MACCURACY)
```

```
ACCURACY = 0.93

SENSITIVITY = 0.94

SPECIFICITY = 0.91

PRECISION = 0.92
```

### Receiver operating curve

READY

```
%pyspark
from pyspark.ml.evaluation import BinaryClassificationEvaluator

#predictions_LR = lrModel.transform(test)
evaluator = BinaryClassificationEvaluator()
print("Test_SET (Area Under ROC): " + str(evaluator.evaluate(test_prediction, {evaluator.metricName: "areaUncest_SET (Area Under ROC): 0.9755296969167018
```

#### **Applying Decision Tree.**

READY

```
%pyspark
from pyspark.ml.classification import DecisionTreeClassifier

dt = DecisionTreeClassifier(labelCol="label", featuresCol="scaledFeatures",maxDepth=3)
Model = dt.fit(trainingData)
train_prediction = Model.transform(trainingData)
test_prediction = Model.transform(testData)
```

#### **Evaluating the Decision Tree.**

READY

```
%pyspark
evaluator = MulticlassClassificationEvaluator(labelCol="label", predictionCol="prediction", metricName="acc
train_accuracy = evaluator.evaluate(train_prediction)
test_accuracy = evaluator.evaluate(test_prediction)
print("Accuracy of DecisionTree on train is = %g"% (train_accuracy))
print("Accuracy of DecisionTree on test is = %g"% (test_accuracy))
#print("Test Error of DecisionTree = %g " % (1.0 - dt_accuracy_test))

Accuracy of DecisionTree on train is = 1
Accuracy of DecisionTree on test is = 1
```

#### Calculating DT model Accuracy, Sensitivity, Specificity, Precision.

READY

```
%pyspark
                                                                                                                                           READY
 TP = cm["1"][0]
 FP = CM[ 1 ][0]
FP = CM["0"][0]
TN = CM["0"][1]
FN = CM["1"][1]
 print(TP,FP,TN,FN)
 Accuracy = (TP+TN)/(TP+TN+FP+FN)
 Sensitivity = TP/(TP+FN)
 Specificity = TN/(TN+FP)
 Precision = TP/(TP+FP)
 print('ACCURACY = %0.2f' %Accuracy)
print('SENSITIVITY = %0.2f' %Sensitivity)
 print('SPECIFICITY = %0.2f' %Specificity)
print('PRECISION = %0.2f' %Precision)
505903 0 470580 0
ACCURACY = 1.00
SENSITIVITY = 1.00
SPECIFICITY = 1.00
PRECISION = 1.00
```

```
%pyspark
from pyspark.ml.evaluation import BinaryClassificationEvaluator
evaluator = BinaryClassificationEvaluator()
print("Test_SET (Area Under ROC): " + str(evaluator.evaluate(test_prediction, {evaluator.metricName: "areaUnctest_SET (Area Under ROC): 1.0
```

#### **Applying Naive Bayes.**

**READY** 

```
%pyspark
from pyspark.ml.classification import NaiveBayes

nb = NaiveBayes(labelCol="label", featuresCol="scaledFeatures")
Model = nb.fit(trainingData)
train_prediction = Model.transform(trainingData)
test_prediction = Model.transform(testData)
```

#### **Evaluating the NB model.**

READY

```
%pyspark
evaluator = MulticlassClassificationEvaluator(labelCol="label", predictionCol="prediction", metricName="acc
train_accuracy = evaluator.evaluate(train_prediction)
test_accuracy = evaluator.evaluate(test_prediction)
print("Accuracy of DecisionTree on train is = %g"% (train_accuracy))
print("Accuracy of DecisionTree on test is = %g"% (test_accuracy))
#print("Test Error of DecisionTree = %g " % (1.0 - dt_accuracy_test))

Accuracy of DecisionTree on train is = 0.913496
Accuracy of DecisionTree on test is = 0.913599
```

#### Calculating NB model Accuracy, Sensitivity, Specificity, Precision.

READY

```
%pyspark

TP = cm["1"][0]
FP = cm["0"][0]
TN = cm["0"][1]
FN = cm["1"][1]
print(TP,FP,TN,FN)

Accuracy = (TP+TN)/(TP+TN+FP+FN)
Sensitivity = TP/(TP+FN)
Specificity = TN/(TN+FP)
Precision = TP/(TP+FP)
print('ACCURACY = %0.2f' %Accuracy)
print('SENSITIVITY = %0.2f' %Sensitivity)
print('SPECIFICITY = %0.2f' %Specificity)
print('PRECISION = %0.2f' %Precision)
```

```
%pyspark
from pyspark.ml.evaluation import BinaryClassificationEvaluator

evaluator = BinaryClassificationEvaluator()
print("Test_SET (Area Under ROC): " + str(evaluator.evaluate(test_prediction, {evaluator.metricName: "areaUnc
```

## **Applying Random Forest.**

READY

```
%pyspark
from pyspark.ml.classification import RandomForestClassifier

Rf = RandomForestClassifier(labelCol = "label",featuresCol = "scaledFeatures")
Model = Rf.fit(trainingData)
train_prediction = Model.transform(trainingData)
test_prediction = Model.transform(testData)
```

#### Calculating RF model Accuracy, Sensitivity, Specificity, Precision.

READY

```
%pyspark
evaluator = MulticlassClassificationEvaluator(labelCol="label", predictionCol="prediction", metricName="acc
train_accuracy = evaluator.evaluate(train_prediction)
test_accuracy = evaluator.evaluate(test_prediction)
print("Accuracy of DecisionTree on train is = %g"% (train_accuracy))
print("Accuracy of DecisionTree on test is = %g"% (test_accuracy))
#print("Test Error of DecisionTree = %g " % (1.0 - dt_accuracy_test))

Accuracy of DecisionTree on train is = 0.7514
Accuracy of DecisionTree on test is = 0.751561
```

```
%pyspark

cm = test_prediction.crosstab('prediction','label')
cm = cm.toPandas()
cm
```

```
%pyspark

TP = cm["1"][0]
FP = cm["0"][0]
TN = cm["0"][1]
FN = cm["1"][1]
print(TP,FP,TN,FN)

Accuracy = (TP+TN)/(TP+TN+FP+FN)
Sensitivity = TP/(TP+FN)
Specificity = TN/(TN+FP)
Precision = TP/(TP+FP)
print('ACCURACY = %0.2f' %Accuracy)
print('SENSITIVITY = %0.2f' %Sensitivity)
print('SPECIFICITY = %0.2f' %Specificity)
print('PRECISION = %0.2f' %Precision)
```

```
%pyspark
from pyspark.ml.evaluation import BinaryClassificationEvaluator

evaluator = BinaryClassificationEvaluator()
print("Test_SET (Area Under ROC): " + str(evaluator.evaluate(test_prediction, {evaluator.metricName: "areaUnc
```