IBM HR Analytics Employee Attrition Modeling.

DESCRIPTION

- IBM is an American MNC operating in around 170 countries with major business vertical as computing, software, and hardware.
- Attrition is a major risk to service-providing organizations where trained and experienced people are the assets of the company. The organization would like to identify the factors which influence the attrition of employees.

Data Dictionary

- · Age: Age of employee
- · Attrition: Employee attrition status
- · Department: Department of work
- DistanceFromHome
- Education: 1-Below College; 2- College; 3-Bachelor; 4-Master; 5-Doctor;
- EducationField
- EnvironmentSatisfaction: 1-Low; 2-Medium; 3-High; 4-Very High;
- JobSatisfaction: 1-Low; 2-Medium; 3-High; 4-Very High;
- MaritalStatus
- MonthlyIncome
- NumCompaniesWorked: Number of companies worked prior to IBM
- WorkLifeBalance: 1-Bad; 2-Good; 3-Better; 4-Best;
- YearsAtCompany: Current years of service in IBM

Analysis Task:

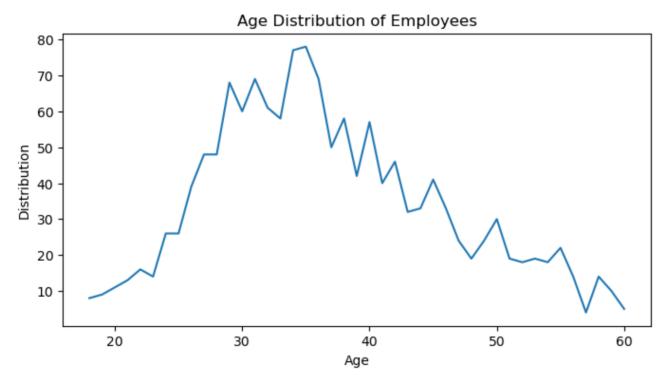
- Import attrition dataset and import libraries such as pandas, matplotlib.pyplot, numpy, and seaborn.
- Exploratory data analysis
 - 1. Find the age distribution of employees in IBM
 - 2. Explore attrition by age
 - 3. Explore data for Left employees
 - 4. Find out the distribution of employees by the education field
 - 5. Give a bar chart for the number of married and unmarried employees
- Build up a logistic regression model to predict which employees are likely to attrite.

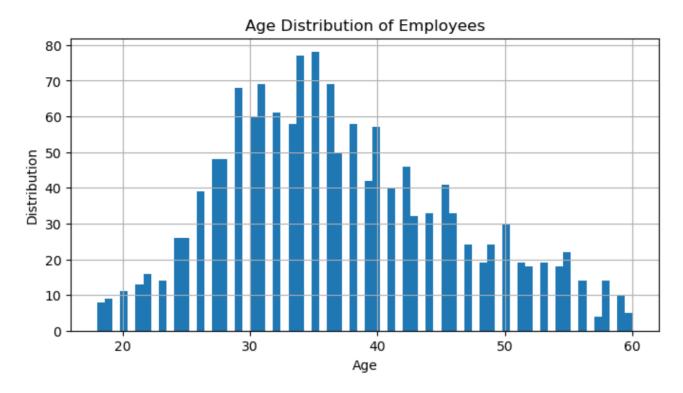
```
In [20]: import pandas as pd
           import matplotlib.pyplot as plt
           import seaborn as sns
           import numpy as np
           %matplotlib inline
 In [3]: dataset = pd.read csv('../datasets/IBM Attrition Data.csv')
In [11]: dataset.shape
Out[11]: (1470, 13)
In [43]: dataset.head()
Out[43]:
              Age Attrition
                           Department DistanceFromHome Education EducationField EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
           0
               41
                       Yes
                                 Sales
                                                                     Life Sciences
                                                                                                    2
                                                                                                                  4
                                                                                                                           Single
                                                                                                                                          5993
                             Research &
                                                                                                                  2
                                                                     Life Sciences
                                                                                                    3
                                                                                                                                          5130
                49
                       No
                                                                                                                          Married
                           Development
                             Research &
                                                                           Other
            2
               37
                                                       2
                                                                2
                                                                                                                  3
                                                                                                                           Single
                                                                                                                                          2090
                            Development
                             Research &
                                                       3
                                                                     Life Sciences
                                                                                                                  3
                                                                                                                                          2909
               33
                                                                                                                          Married
                            Development
                             Research &
               27
                                                       2
                                                                1
                                                                         Medical
                                                                                                                  2
                                                                                                                          Married
                                                                                                                                          3468
                            Development
```

Find the age distribution of employees in IBM

```
In [12]: age_grouped = dataset.groupby('Age')
In [30]: index = age_grouped.size().index
In [37]: data = age_grouped.size().values
```

```
In [86]: plt.figure(figsize=(8,4))
    plt.plot(age_grouped.size())
    plt.title("Age Distribution of Employees")
    plt.xlabel('Age')
    plt.ylabel('Distribution')
    plt.figure(figsize=(8,4))
    dataset['Age'].hist(bins=70)
    plt.title("Age Distribution of Employees")
    plt.xlabel('Age')
    plt.ylabel('Distribution')
    plt.show()
```





explore attrition by age

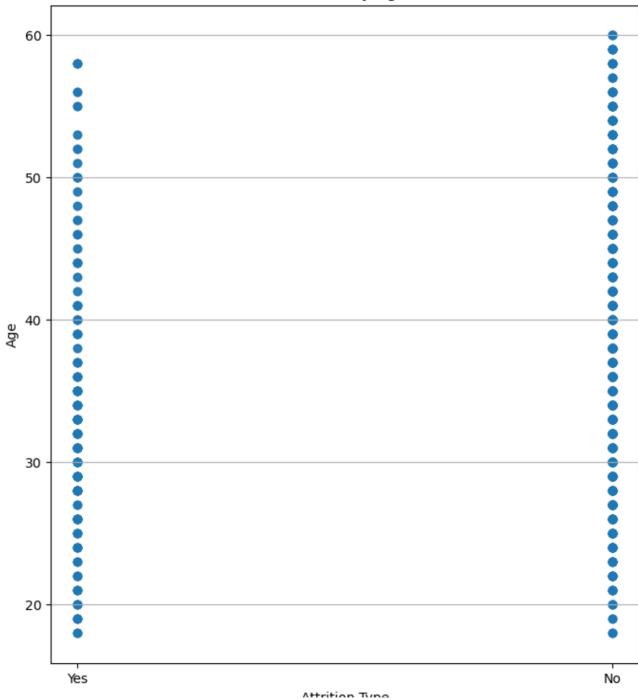
```
In [55]: attrition_grouped = dataset.groupby(['Age','Attrition'])
```

```
In [56]: attrition_grouped.size()
Out[56]: Age Attrition
         18
              No
                            4
              Yes
                            4
         19
              No
                            3
              Yes
         20
              No
         57
              No
                            4
         58
              No
                            9
                            5
              Yes
         59
                           10
              No
         60
                            5
              No
         Length: 82, dtype: int64
```

```
In [92]: plt.figure(figsize=(8,9))
    plt.scatter(dataset.Attrition,dataset.Age,alpha=.75)
    plt.title("Attrition by Age")
    plt.ylabel('Age')
    plt.xlabel('Attrition Type')
    plt.grid(b=True,which='major',axis='y')
    plt.show()
```

/var/folders/tm/ffwlhhvs4hjbp97q0xdt53r80000gn/T/ipykernel_9047/4294918261.py:6: MatplotlibDeprecationWarning: The 'b' parameter of grid() has been renamed 'visible' since Matplotlib 3.5; support for the old name will be dropped tw o minor releases later. plt.grid(b=True,which='major',axis='y')

Attrition by Age



In [57]: attrition_grouped.first()

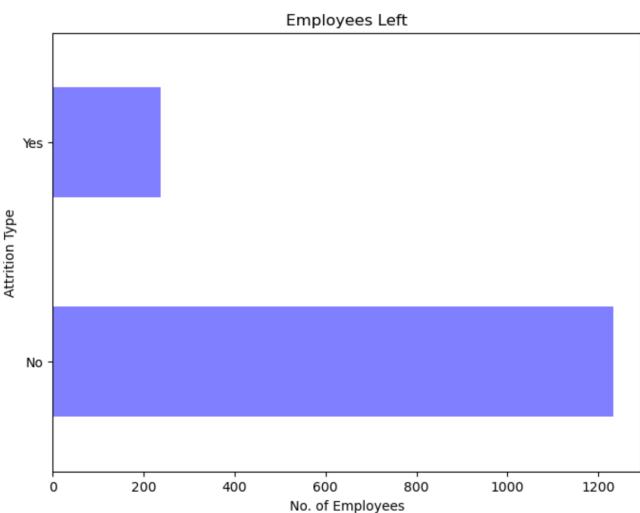
Out[57]:

| | | Department | DistanceFromHome | Education | EducationField | EnvironmentSatisfaction | JobSatisfaction | MaritalStatus | MonthlyIncome | NumCompa |
|-----|-----------|------------------------|------------------|-----------|----------------|-------------------------|-----------------|---------------|---------------|----------|
| Age | Attrition | | | | | | | | | |
| 18 | No | Sales | 10 | 3 | Medical | 4 | 3 | Single | 1200 | |
| | Yes | Research & Development | 3 | 3 | Life Sciences | 3 | 3 | Single | 1420 | |
| 19 | No | Research & Development | 3 | 1 | Medical | 2 | 2 | Single | 1483 | |
| | Yes | Sales | 22 | 1 | Marketing | 4 | 3 | Single | 1675 | |
| 20 | No | Research & Development | 1 | 3 | Life Sciences | 4 | 2 | Single | 2836 | |
| | | | ••• | | | | | | | |
| 57 | No | Research & Development | 24 | 2 | Life Sciences | 3 | 4 | Divorced | 9439 | |
| 58 | No | Sales | 10 | 4 | Medical | 4 | 3 | Single | 13872 | |
| | Yes | Research & Development | 23 | 4 | Medical | 4 | 4 | Married | 10312 | |
| 59 | No | Research & Development | 3 | 3 | Medical | 3 | 1 | Married | 2670 | |
| 60 | No | Research & Development | 7 | 3 | Life Sciences | 1 | 1 | Married | 19566 | |

82 rows × 11 columns

Explore data for Left employees

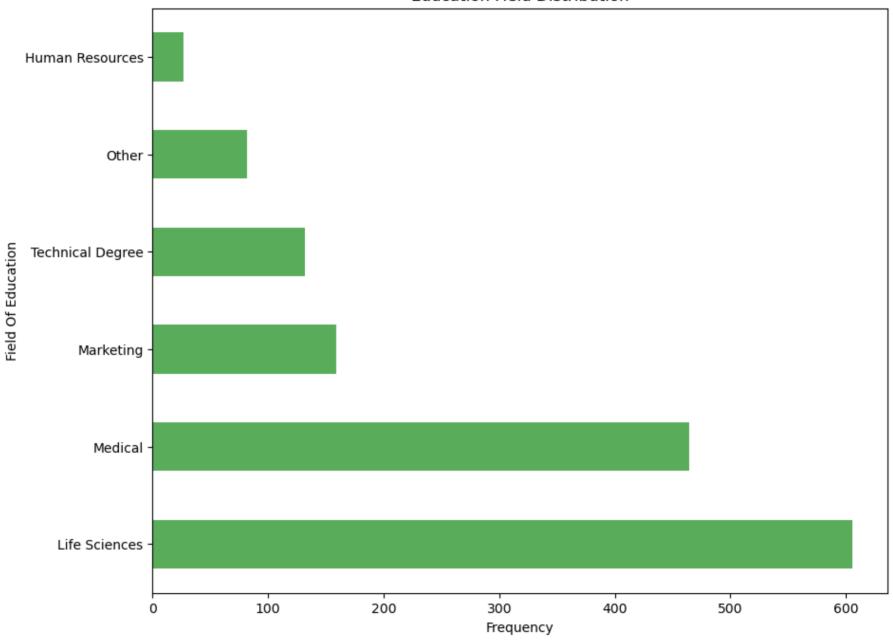
```
In [128]: plt.figure(figsize=(8,6))
    dataset.Attrition.value_counts().plot(kind='barh',color='b',alpha=.5)
    plt.title('Employees Left')
    plt.xlabel('No. of Employees')
    plt.ylabel('Attrition Type')
    plt.show()
```



Find out the distribution of employees by the education field

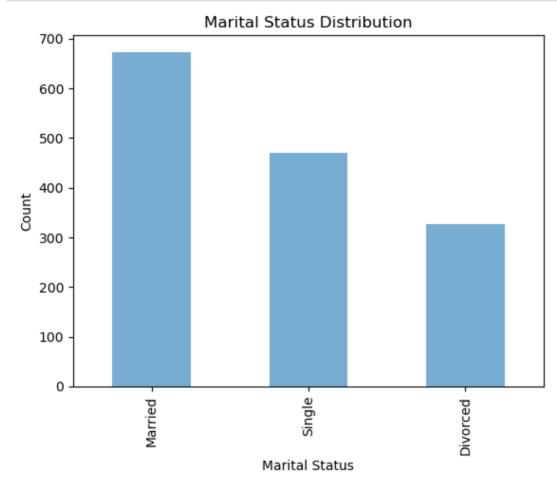
```
In [63]: education field = dataset.groupby('EducationField')
In [64]: education_field.size()
Out[64]: EducationField
         Human Resources
                              27
         Life Sciences
                             606
         Marketing
                             159
         Medical
                             464
         Other
                              82
         Technical Degree
                             132
         dtype: int64
```

Education Field Distribution



Give a bar chart for the number of married and unmarried employees

```
In [130]: plt.title('Marital Status Distribution')
    dataset.MaritalStatus.value_counts().plot(kind='bar',alpha=.6)
    plt.ylabel('Count')
    plt.xlabel('Marital Status')
    plt.show()
```



Model Building

Pre Processing data

```
In [152]: from sklearn.linear model import LogisticRegression
           from sklearn.preprocessing import LabelEncoder, StandardScaler
           from sklearn.model selection import train test split
           from sklearn.metrics import accuracy score, confusion matrix, classification report
In [133]:
           dataFrame = dataset
In [134]: dataFrame.head()
Out[134]:
                           Department DistanceFromHome Education EducationField EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
                                                                   Life Sciences
                                                                                                 2
            0
                41
                       Yes
                                 Sales
                                                                                                               4
                                                                                                                       Single
                                                                                                                                      5993
                             Research &
                49
                        No
                                                     8
                                                                   Life Sciences
                                                                                                 3
                                                                                                               2
                                                                                                                      Married
                                                                                                                                      5130
                            Development
                             Research &
                37
                                                     2
                                                               2
                                                                         Other
                                                                                                               3
                                                                                                                                      2090
                                                                                                                       Single
                            Development
                             Research &
                33
                                                                   Life Sciences
                                                                                                               3
                                                                                                                      Married
                                                                                                                                      2909
                            Development
                             Research &
                27
                                                               1
                                                                       Medical
                                                                                                               2
                                                                                                                                      3468
                                                                                                                      Married
                           Development
           dataFrame['Attrition'].replace('Yes',1,inplace=True)
In [138]:
           dataFrame['Attrition'].replace('No',0,inplace=True)
```

```
In [139]: | dataFrame.head()
Out[139]:
                Age Attrition Department DistanceFromHome Education Education Field EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
                                                        1
                                                                                                      2
                                                                                                                     4
             0
                 41
                          1
                                   Sales
                                                                       Life Sciences
                                                                                                                              Single
                                                                                                                                             5993
                              Research &
                 49
                          0
                                                        8
                                                                       Life Sciences
                                                                                                      3
                                                                                                                     2
                                                                                                                             Married
                                                                                                                                             5130
                             Development
                              Research &
                                                                  2
                                                                             Other
                                                                                                                     3
             2
                 37
                                                        2
                                                                                                      4
                                                                                                                              Single
                                                                                                                                             2090
                             Development
                              Research &
             3
                 33
                          0
                                                        3
                                                                       Life Sciences
                                                                                                      4
                                                                                                                     3
                                                                                                                             Married
                                                                                                                                             2909
                             Development
                              Research &
                                                        2
                                                                                                                     2
                 27
                                                                  1
                                                                           Medical
                                                                                                                             Married
                                                                                                                                             3468
                             Development
In [140]: dataFrame.Department.value counts()
Out[140]: Research & Development
                                            961
            Sales
                                            446
            Human Resources
                                             63
            Name: Department, dtype: int64
           dataFrame['Department'].replace('Research & Development',1, inplace=True)
In [142]:
            dataFrame['Department'].replace('Sales',2, inplace=True)
            dataFrame['Department'].replace('Human Resources', 3, inplace=True)
In [143]:
           dataFrame.head()
Out[143]:
                Age Attrition Department DistanceFromHome Education EducationField EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
                 41
                                      2
                                                                  2
                                                                       Life Sciences
                                                                                                      2
             0
                          1
                                                        1
                                                                                                                    4
                                                                                                                             Single
                                                                                                                                             5993
                 49
                          0
                                      1
                                                        8
                                                                  1
                                                                       Life Sciences
                                                                                                      3
                                                                                                                     2
                                                                                                                            Married
                                                                                                                                             5130
                                                        2
                                                                                                                    3
                 37
                          1
                                                                  2
                                                                             Other
                                                                                                                             Single
                                                                                                                                             2090
             2
                                      1
                 33
                          0
                                     1
                                                        3
                                                                  4
                                                                       Life Sciences
                                                                                                                    3
                                                                                                                            Married
                                                                                                                                             2909
             3
             4
                 27
                          0
                                      1
                                                        2
                                                                  1
                                                                           Medical
                                                                                                                    2
                                                                                                                            Married
                                                                                                                                             3468
```

```
In [144]: dataFrame.EducationField.value counts()
Out[144]: Life Sciences
                                606
           Medical
                                464
           Marketing
                                159
           Technical Degree
                                132
           Other
                                 82
                                 27
           Human Resources
           Name: EducationField, dtype: int64
In [145]: dataFrame['EducationField'].replace('Life Sciences',1, inplace=True)
           dataFrame['EducationField'].replace('Medical',2, inplace=True)
           dataFrame['EducationField'].replace('Marketing', 3, inplace=True)
           dataFrame['EducationField'].replace('Other',4, inplace=True)
           dataFrame['EducationField'].replace('Technical Degree',5, inplace=True)
           dataFrame['EducationField'].replace('Human Resources', 6, inplace=True)
In [146]: dataFrame.head()
Out[146]:
              Age Attrition Department DistanceFromHome Education EducationField EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
               41
                                 2
                                                           2
                                                                       1
                                                                                           2
           0
                       1
                                                  1
                                                                                                       4
                                                                                                               Single
                                                                                                                             5993
               49
                       0
                                                  8
                                                           1
                                                                                                       2
                                                                                                              Married
                                                                                                                             5130
           2
               37
                       1
                                 1
                                                           2
                                                                                                       3
                                                                                                               Single
                                                                                                                             2090
               33
                                                                                                       3
                                                                                                              Married
                                                                                                                             2909
               27
                       0
                                                  2
                                                           1
                                                                       2
                                                                                                       2
                                                                                                                             3468
                                 1
                                                                                                              Married
In [147]: dataFrame.MaritalStatus.value counts()
Out[147]: Married
                        673
           Single
                        470
           Divorced
                        327
           Name: MaritalStatus, dtype: int64
```

```
In [148]: dataFrame['MaritalStatus'].replace('Married',1, inplace=True)
           dataFrame['MaritalStatus'].replace('Single',2, inplace=True)
          dataFrame['MaritalStatus'].replace('Divorced',3, inplace=True)
In [149]: dataFrame.head()
Out[149]:
              Age Attrition Department DistanceFromHome Education EducationField EnvironmentSatisfaction JobSatisfaction MaritalStatus MonthlyIncome NumCom
                                 2
                                                          2
                                                                                                                  2
               41
                       1
                                                                       1
                                                                                          2
           0
                                                                                                                             5993
               49
                       0
                                 1
                                                 8
                                                          1
                                                                       1
                                                                                          3
                                                                                                       2
                                                                                                                  1
                                                                                                                             5130
           2
               37
                                 1
                                                 2
                                                          2
                                                                                                       3
                                                                                                                  2
                                                                                                                             2090
                                                          4
                                                                                                       3
                                                                                                                             2909
               27
                       0
                                 1
                                                 2
                                                          1
                                                                       2
                                                                                                       2
                                                                                                                             3468
                                                                                                                  1
In [150]: dataFrame.dtypes
Out[150]: Age
                                        int64
           Attrition
                                        int64
           Department
                                        int64
           DistanceFromHome
                                        int64
           Education
                                        int64
           EducationField
                                        int64
           EnvironmentSatisfaction
                                        int64
           JobSatisfaction
                                        int64
           MaritalStatus
                                        int64
           MonthlyIncome
                                        int64
           NumCompaniesWorked
                                        int64
           WorkLifeBalance
                                        int64
           YearsAtCompany
                                        int64
           dtype: object
In [157]: X = dataFrame.drop('Attrition',axis=1).values
           y = dataFrame.Attrition.values
In [161]: X = StandardScaler().fit transform(X)
```

```
In [164]: X train, X test, y train, y test = train test split(X,y,train size=0.7,random state=0)
In [166]: classifier = LogisticRegression().fit(X train,y train)
In [167]: y pred = classifier.predict(X test)
In [168]: accuracy score(y test,y pred)
Out[168]: 0.8435374149659864
In [169]: confusion matrix(y test,y pred)
Out[169]: array([[367,
                         4],
                         5]])
                 [ 65,
In [171]: print(classification_report(y_test,y_pred))
                        precision
                                     recall f1-score
                                                         support
                     0
                             0.85
                                        0.99
                                                  0.91
                                                             371
                             0.56
                                       0.07
                                                  0.13
                     1
                                                              70
                                                  0.84
                                                             441
              accuracy
                                                  0.52
                                                             441
             macro avq
                             0.70
                                        0.53
          weighted avg
                                                  0.79
                             0.80
                                        0.84
                                                             441
 In [ ]:
```