DATA SCIENCE PROJECT ON INX FUTURE INC EMPLOYEE PERFORMANCE ANALYSIS

BUISNESS CASE:BASED ON GIVEN FEATURE OF DATASET WE NEED TO PREDICT THE PERFOMANCE RATING OF EMPLOYEE

VISUALIZATION SUMMARY:

- 1. Domain Analysis Of all features
- 2. Univariate Analysis with insights
- 3. Bivariate Analysis with insights
- 4. Multivariat Analysis with insights

IMPORTING THE NECESSAERY LIBRARY

```
import pandas as pd
import pyodbc
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
sns.set_style('darkgrid') # setting up background
from scipy import stats

# TO avoid warnings
import warnings
warnings.filterwarnings('ignore')
```

IMPORT DATA FROM SQL SERVER USING PYODBC

EmpNumber Age Gender EducationBackground MaritalStatus EmpDepartment \ 0 1001000.0 3 32 Male Marketing Single Sales 1 1001006.0 47 Male Marketing Single Sales 2 1001007.0 40 Male Life Sciences Married Sales 3 1001009.0 41 Male Human Resources Divorced Human Resources 4 1001010.0 60 Male Marketing Single Sales EmpLobRole BusinessTravelFrequency DistanceFromHome \ 0 Sales Executive Travel Rarely 10 Travel Rarely 14 Sales Executive Travel Rarely 14 Sales Executive Travel Rarely 10 Travel Rarely 16 EmpEducationLevel EmpRelationshipSatisfaction \ 0 Sales Executive Travel Rarely 16 EmpEducationLevel EmpRelationshipSatisfaction \ 1 Sales Executive Travel Rarely 16 Travel Rarely 16 EmpEducationLevel EmpRelationshipSatisfaction \ 1 Sales Executive Travel Rarely 16 EmpEducationLevel Sales Executive Travel Rarely 10 Trave
0 1001000.0 32 Male Marketing Single Sales 1 1001006.0 47 Male Marketing Single Sales 2 1001007.0 40 Male Life Sciences Married Sales 3 1001009.0 41 Male Human Resources Divorced Human Resources 4 1001010.0 60 Male Marketing Single Sales Executive Travel Rarely 10 10 Sales Executive Travel Rarely 14 14 2 Sales Executive Travel Frequently 5 5 3 Manager Travel Rarely 10 16 EmpEducationLevel EmpRelationshipSatisfaction 4 4 4 1 4 4 3 3 3 3 4 2 4 4 4 2 4 2 4 4 2 2 4 4 5 2 2 2 1 6 2 2 2 2 7 2 2 2 3 8 2
1 1001006.0
2 1001007.0 40 Male Life Sciences Married Sales 3 1001009.0 41 Male Human Resources Divorced Human Resources 4 1001010.0 60 Male Marketing Single Sales EmpJobRole BusinessTravelFrequency DistanceFromHome \
3
EmpJobRole BusinessTravelFrequency DistanceFromHome Sales Executive Travel_Rarely 10 Sales Executive Travel_Rarely 14 Sales Executive Travel_Rarely 14 Sales Executive Travel_Rarely 10 Sales Executive Travel_Rarely 10 Sales Executive Travel_Rarely 10 Sales Executive Travel_Rarely 10 EmpEducationLevel EmpRelationshipSatisfaction EmpEducationLevel EmpRelationshipSatisfaction Sales Sales Sales Sales Sales Executive Travel_Rarely Sales Sales Executive Travel_Rarely Sales Sales Executive Travel_Rarely Sales Sales Executive Travel_Rarely Sales Sales Sales Sales Sales S
Sales Executive
0
EmpWorkLifeBalance \ 0
<pre>0</pre>
<pre>1</pre>
3 3 23 2 4 10 1 3 ExperienceYearsAtThisCompany ExperienceYearsInCurrentRole \ 0 10 7 1 7 7 2 18 13 3 21 6 4 2 2 YearsSinceLastPromotion YearsWithCurrManager Attrition PerformanceRating
23 2 4 10 1 3 ExperienceYearsAtThisCompany ExperienceYearsInCurrentRole \ 0 10 7 1 7 7 2 18 13 3 21 6 4 2 2 YearsSinceLastPromotion YearsWithCurrManager Attrition PerformanceRating
ExperienceYearsAtThisCompany ExperienceYearsInCurrentRole \ 10
ExperienceYearsAtThisCompany ExperienceYearsInCurrentRole \ 0
0 10 7 1 7 7 2 18 13 3 21 6 4 2 2 YearsSinceLastPromotion YearsWithCurrManager Attrition PerformanceRating
YearsSinceLastPromotion YearsWithCurrManager Attrition PerformanceRating
PerformanceRating
0 8 False

3			
1	1	7	False
3			
2	1	12	False
4			
3	12	6	False
3			
4	2	2	False
3			
[5 rows x 28 columns]			

DOMAIN ANALYSIS

First understand the menaing of feature and checking the impact of input feature to dependant feature

1.EmpNumber:

An Employee ID, sometimes referred to as an Employee Number or Employee Code, is a unique number that has been assigned to each individual staff member within a company.

2.Age:

Age of employee in years

3.Gender:

Gender of employee [Male/Feamale]

4.EducationBackground:

This will be a high school diploma or a post-secondary degree of a employee

5. Marital Status:

Civil status, or marital status, are the distinct options that describe a person's relationship with a significant other

6.EmpDepartment:

Department specifice of employee

7.EmpJobRole:

Job role means the key responsibility of a job profile or job position.

8.BusinessTravelFrequency:

The employee travel for comapny buisness purpose.

9.DistanceFromHome:

Distance between home to company of employee.

10.EmpEducationLevel:

Employee Education level means the academic qualification. For example, it could be a diploma, degree, masters or PhD.

11.EmpEnvironmentSatisfaction:

satisfied or content employees are with elements like their jobs, their employee experience, and the organizations they work for.

12.EmpHourlyRate:

Hourly Rate means the amount paid to an employee for each hour worked.

13.EmpJobInvolvement:

Job involvement refers to a state of psychological identification with work—or the degree to which a job is central to a person's identity. From an organizational perspective, it has been regarded as the key to unlocking employee motivation and increasing productivity.

14.EmpJobLevel:

Job levels, also known as job grades and classifications, set the responsibility level and expectations.

15.EmpJobSatisfaction:

level of contentment employees feel with their job.

16.NumCompaniesWorked:

employee work in how many companies.

17.OverTime:

employee work overtime or not. [True, False]

18.EmpLastSalaryHikePercent:

salary hike percent of employye in last year.

19.EmpRelationshipSatisfaction:

Healthy relationships may motivate employees and increase morale. When employees cast aside relationship issues, they can focus on work tasks more effectively.

20.TotalWorkExperienceInYears:

Total experiance of employee in years.

21.TrainingTimesLastYear:

Total training done by employee in last year.

22.EmpWorkLifeBalance:

"Work-life balance" typically means the achievement by employees of equality between time spent working and personal life. A good work-life balance for employees can improve staff motivation, increase staff retention rates, reduce absence, attract new talent, and reduce employee stress.

23.ExperienceYearsAtThisCompany:

Total no of eaxperiance at current company.

24.ExperienceYearsInCurrentRole:

Total no of experiance in current job role.

25.YearsSinceLastPromotion:

Total no of year since last promotion of employee.

26.YearsWithCurrManager:

Employee total no of years with current manager.

27.Attrition:

Employee attrition is the naturally occurring, voluntary departure of employees from a company. Employee attrition involves leaving a job for: Personal reasons. Professional motivation.

28.PerformanceRating:

This is a target feature, tell that the total rating of employee performance in company.

UNIVARIATE ANALYSIS

PLOTS USED:

continuous features

- histogram: A histogram is a bar graph-like representation of data that buckets a range of classes into columns along the horizontal x-axis. The vertical y-axis represents the number count or percentage of occurrences in the data for each column.
- lineplots: A Line plot can be defined as a graph that displays data as points or check marks above a number line, showing the frequency of each value.

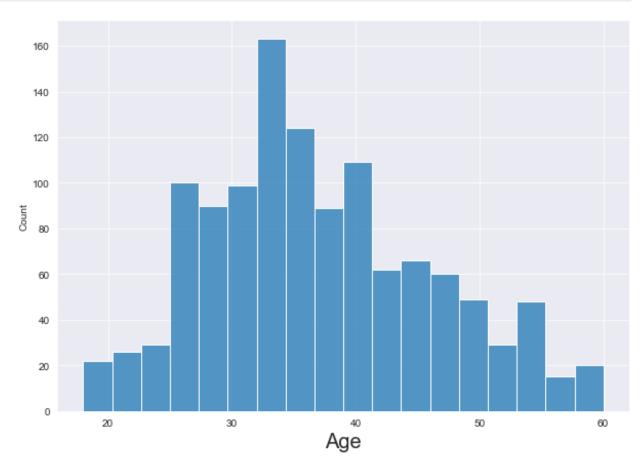
Discrete and Categorical

• Countplot: countplot is used to Show the counts of observations in each categorical bin using bars.

1.Age

```
plt.figure(figsize=(10,7))
sns.histplot(x='Age',data=data)
```

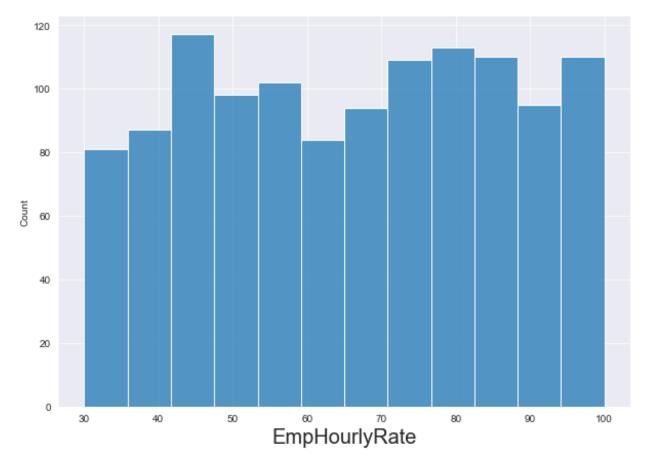
```
plt.xlabel('Age',fontsize=20)
plt.show()
```



• The range of age between 18 to 60, most of the employee age between 25 to 40.

2.Employee Hourly Rate

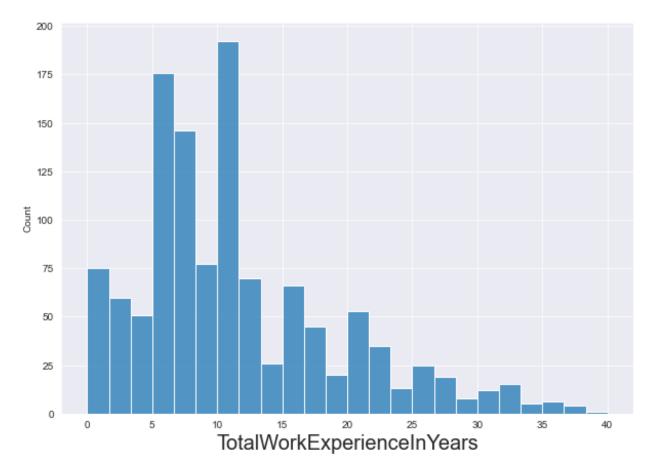
```
plt.figure(figsize=(10,7))
sns.histplot(x='EmpHourlyRate',data=data)
plt.xlabel('EmpHourlyRate',fontsize=20)
plt.show()
```



Observation: The range of employee hourly rate between 30 to 100, most of the employee hourly rate is 45.

3.Total Work Experience In Year

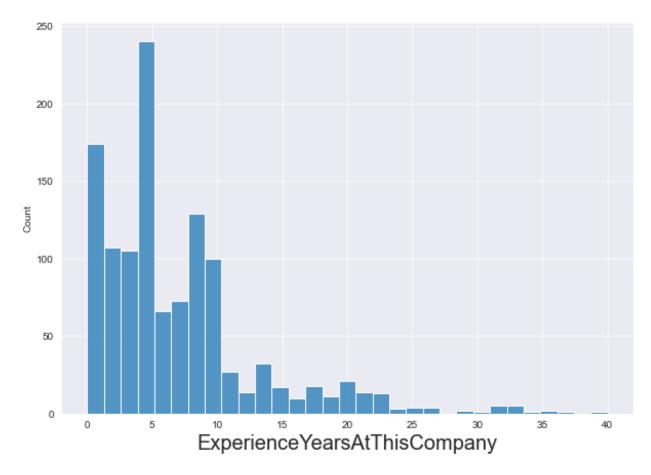
```
plt.figure(figsize=(10,7))
sns.histplot(x='TotalWorkExperienceInYears',data=data)
plt.xlabel('TotalWorkExperienceInYears',fontsize=20)
plt.show()
```



Observation: Work experiance range between 0 to 40, Most of the employee experiance ranges between 5 to 10.

4. Experience Years At This Company

```
plt.figure(figsize=(10,7))
sns.histplot(x='ExperienceYearsAtThisCompany',data=data)
plt.xlabel('ExperienceYearsAtThisCompany',fontsize=20)
plt.show()
```

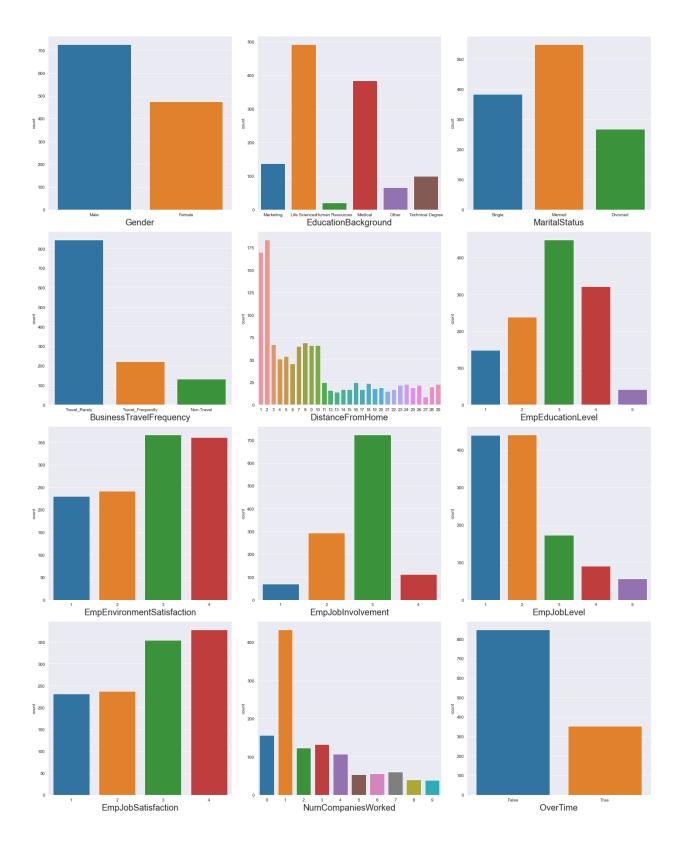


Observation: The Range of experiance in same comapny is 0 to 40, most of the employee join between 0 to 5.

USE SUBPLOT TO PLOTS MULTIPLE FEATURE

```
count = data[['Gender', 'EducationBackground',
'MaritalStatus', 'BusinessTravelFrequency', 'DistanceFromHome',
              'EmpEducationLevel',
'EmpEnvironmentSatisfaction', 'EmpJobInvolvement', 'EmpJobLevel',
              'EmpJobSatisfaction', 'NumCompaniesWorked', 'OverTime']]
# making lsit of next 12 feature
plt.figure(figsize=(20,25)) # defining canvas size
plotno = 1 # counter
for column in count: # iteration of columns / acessing the columns
from count
    if plotno<=13: # set the limit
        plt.subplot(4,3,plotno) # # plotting 12 graphs (4-rows,3-
columns) , plotnumber is for count
        sns.countplot(x=count[column]) # Plotting count plots because
the feature data type is discerte and categorical
        plt.xlabel(column,fontsize=20) # assigning name to x-axis and
```

```
font size is 20
    plotno+=1 # counter increment
plt.tight_layout()
plt.show() # used to hide the storage loction
```



5.Gender:

• Most of the male present in the comapany

6.Education Background:

- most of the education background of employee is Life science and medical, as well as marketing eduaction background employee is more than 100.
- other eduacation background employee is less than 100.

7. Marital Status:

- Most of the employee is married as well as less than 400 employee is single.
- less than 300 employee mariatal status is divorced.

8. Business Travel Frequency:

- Maximum no of employee travel rarely for company buisness purpose, less than 220 employee travel frequently
- remaining less than 120 employee not travell for buisness purpose.

9. Distance From Home:

- The range of distance between home to comapny is 1 to 29.
- Maximum no of employee home to company distance is less than 10.

10.Educational Level:

- Total range of educational level is 1 to 5, Maximum no of employee education level is 3 &
- 2 education level employee is less than 250 and remianing 1 & 5 education level employee is less than 150.

11. Employee Environment Satisfaction:

- Most of the employee Statisfaction is 3 & 4
- 1 & 2 environment satisfaction employee less than 250

12.Employee Job Involvement:

- Most of the employee job involvement is 3 as well as 2 job involment employee is less than 300.
- Remaining 1 and 4 job involvment employee is less than 100.

13.Employee Job Level:

- The range of employee job kevel is 1 to 5, most of the employee job level is 1 & 2.
- Minimum no of job level is 5, as well as 3 & 4 job level employee is less than 180.

14.Employee Job Satisfaction:

• Most of the employee job satisfaction is 3 & 4 score as well as 1 & 2 score jon satisfaction employee is less than 250.

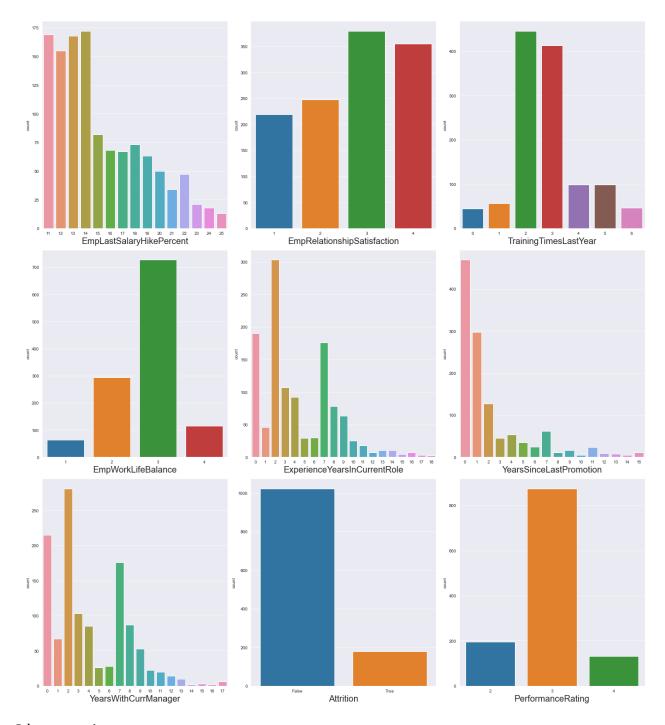
15. Number Companies Worked:

- Maximum no of employee work with only one company.
- less no of employee work in more than 5 companies.

16.Overtime:

 Most no of employee on doing over time and less than 350 employee doing overtime in company.

```
count2 = data[['EmpLastSalaryHikePercent',
'EmpRelationshipSatisfaction','TrainingTimesLastYear','EmpWorkLifeBala
nce',
               'ExperienceYearsInCurrentRole',
'YearsSinceLastPromotion', 'YearsWithCurrManager', 'Attrition',
               'PerformanceRating']] #Making nex feature list to plot
the graph
plt.figure(figsize=(20,22)) # defining canvas size
plotno = 1 # counter
for column in count2: # iteration of columns / acessing the columns
from count
    if plotno<=10: # set the limit
        plt.subplot(3,3,plotno) # # plotting 9 graphs (3-rows,3-
columns) ,plotnumber is for count
        sns.countplot(x=count2[column]) # Plotting count plots because
the feature data type is discerte and categorical
        plt.xlabel(column,fontsize=20) # assigning name to x-axis and
font size is 20
    plotno+=1 # counter increment
plt.tight layout()
plt.show() # used to hide the storage loction
```



17.Employee Last Salary Hike Percent:

- Most no of employee salary hike percentage between 11 to 14%.total range of salary hike is 11 to 25.
- less than 80 employee last salary hike in between 15 to 19.

18. Employee Relationship Satisfaction:

• The range of employee relationship satisfaction is 1 to 4,Most of the relation satisfaction is 3 & 4 as well as less than 250 employee with 1 & 2 relationship satisfaction.

19. Training Times LastYear:

• The range of training time in last year between 0 to 6, Most of the employee doing 2 & 3 rd time training and remaining all times is less than 100.

20.Employee Work Life Balance:

- Most most the work life balance is 3 than less than 300 employee work life balance is 2.
- Minimum work life balance is 1 as well as less than 100 employee work life balance is 4.

21. Experiance In Current Role:

- Maximum current role experiance of employee is 18.
- Most of the employee have 2 years of expriance in current role then 7 year of experiance employee is less than 180
- less than 200 employee have not current role experiance.

22. Years Since Last Promotion:

- The range of year since last promotion is 0 to 15.
- Most of the employee has not promoted in last year less than 300 employee has promoted atleast 1 year.

23. Years With Current Manager:

- Most employee have 2 years with current manager and minimum 16 years with current manager.
- The range in between 0 to 17 and less than 180 employee has 7 years with current manager.

24. Attrition:

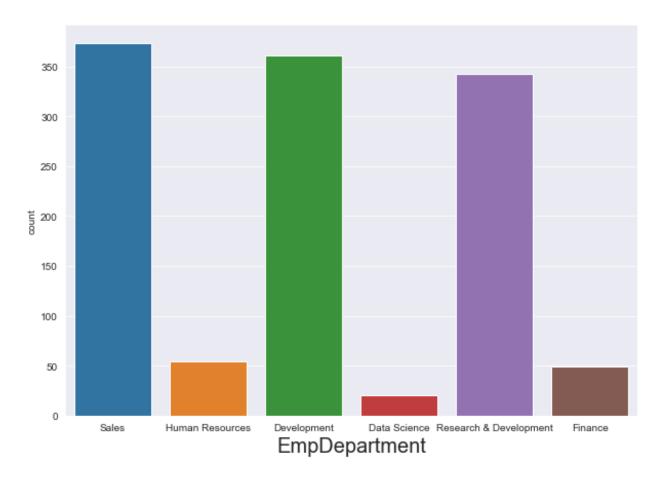
 Maximum no of employee has not leave the company and less than 200 employee has going to leave the company.

25. Target Feature == Performance Rating:

- The range of performance rating is 2 to 4, most of the employee have 3 performance ranting and less performance rating is 4.
- less than 200 employee has 2 performance rating.

26.Employee Department

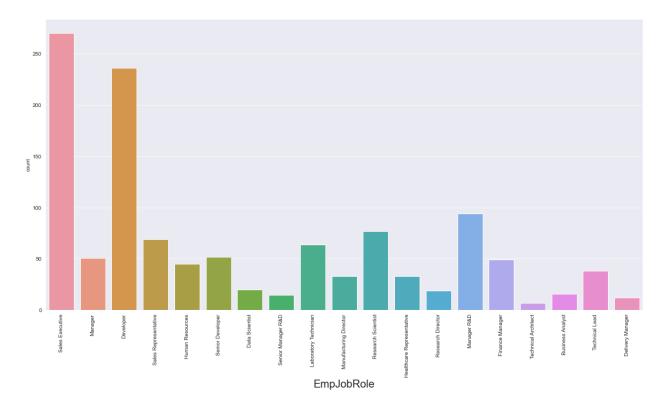
```
plt.figure(figsize=(10,7))
sns.countplot('EmpDepartment', data=data)
plt.xlabel('EmpDepartment', fontsize=20)
plt.show()
```



- Most of the employee from sales department as well as Development and research & Development department employee is less than 320
- Human resources & finance department employee is almost equal.
- Data science employee has minimum in company.

27.Employee Job Role

```
plt.figure(figsize=(20,10))
sns.countplot('EmpJobRole',data=data)
plt.xticks(rotation='vertical')
plt.xlabel('EmpJobRole',fontsize=20)
plt.show()
```



- Sales executive employee job role is maximum as well as Developer job role employee count is 230.
- Manage R& D and research scientist employee is less than 100 and remaining all job role employee is less than 65.

BIAVARIATE ANALYSIS

• In Bivariate analysis Checking the relation between two features

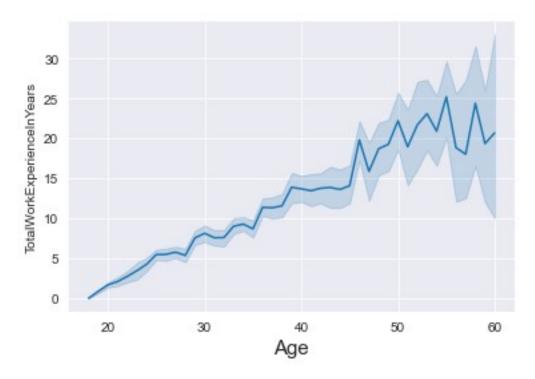
ANALYSIS ON CONTINUOUS FEATURE

PLOT USED:

- Histogram, line plot used for continuous features
- Count used for categorical & Discrete data.

1. Relation Between age & Experience Years At This Company

```
sns.lineplot(x='Age',y='TotalWorkExperienceInYears',data=data)
plt.xlabel('Age',fontsize=15)
plt.show()
```



- If the age in between 18 to 25 then the total year of experiance is less than 5 year.
- If the age is increases that time experiance also increases.

2.Relation Between experiance year at this company & total work experiance

```
sns.lineplot(x='ExperienceYearsAtThisCompany',y='TotalWorkExperienceIn
Years',data=data)
plt.xlabel('ExperienceYearsAtThisCompany',fontsize=15)
plt.show()
```



• If he experiance year at this company that time total work experiance also increases.

3. Relation between Employee last salary hike and number of company worked

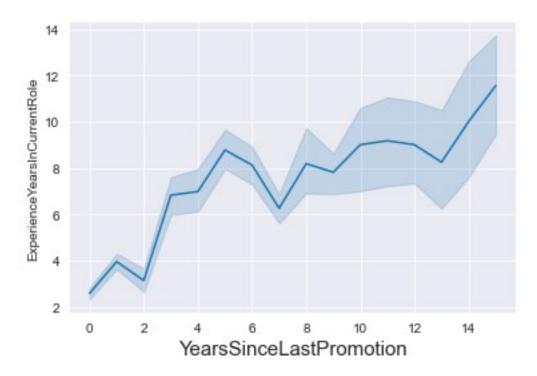
```
sns.lineplot(x='EmpLastSalaryHikePercent',y='NumCompaniesWorked',data=
data)
plt.xlabel('EmpLastSalaryHikePercent',fontsize=15)
plt.show()
```



• If the employee has work 1 or 2 company that time employee last salary hike percent is increases.

4. Relation between Years Since Last Promotion and Experience Years In CurrentRole

```
sns.lineplot(x='YearsSinceLastPromotion',y='ExperienceYearsInCurrentRo
le',data=data)
plt.xlabel('YearsSinceLastPromotion',fontsize=15)
plt.show()
```



• In above plot clearly seen that year since last promotion is increases that time employee has more experience with current role

5. Relation between Employee Hourly Rate and Years With Current Manager

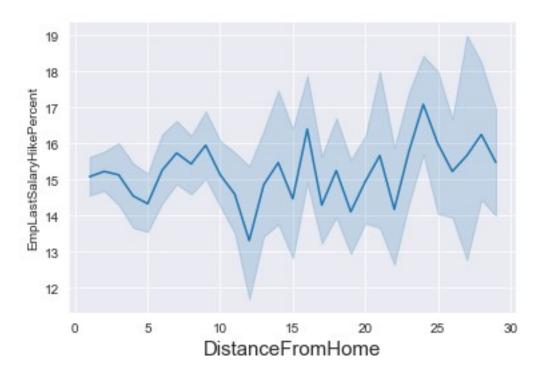
```
sns.lineplot(x='EmpHourlyRate',y='YearsWithCurrManager',data=data)
plt.xlabel('EmpHourlyRate',fontsize=15)
plt.show()
```



• most of the employee hourly rate with their current manager is constant, but some of the employees has maximum hourly rate with less no of year with current manager.

6.Relation between Distance From Home and Employee Last Salary Hike Percent

```
sns.lineplot(x='DistanceFromHome',y='EmpLastSalaryHikePercent',data=da
ta)
plt.xlabel('DistanceFromHome',fontsize=15)
plt.show()
```



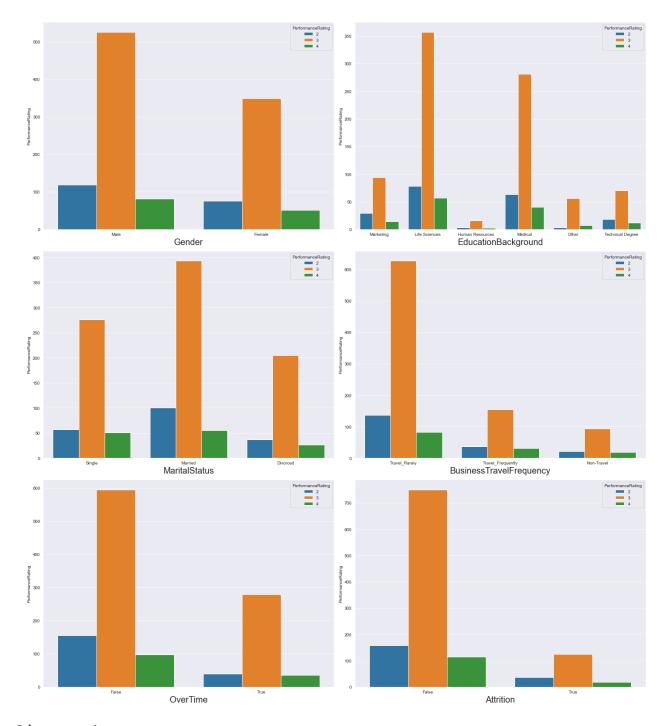
- If the distance from home is more then the employee salary hike is slightly increases.
- distance from home between 10 to 13 that time employee salary hike is decreases.

ANALYSIS ON CATEGORICAL AND DISCERETE FEATURE

CREATE A NEW DATAFRAME FOR CATEGORICAL FEATURES.

```
categorical = [] # Create empty list to store the feature
for column in data.columns:
   if data[column].dtype == object:
       categorical.append(column)
       print(f"{column} : {data[column].unique()}")
       print("======="")
Gender : ['Male' 'Female']
EducationBackground : ['Marketing' 'Life Sciences' 'Human Resources'
'Medical' 'Other'
 'Technical Degree'l
_____
MaritalStatus : ['Single' 'Married' 'Divorced']
_____
EmpDepartment : ['Sales' 'Human Resources' 'Development' 'Data
Science'
 'Research & Development' 'Finance']
EmpJobRole : ['Sales Executive' 'Manager' 'Developer' 'Sales
```

```
Representative'
 'Human Resources' 'Senior Developer' 'Data Scientist'
 'Senior Manager R&D' 'Laboratory Technician' 'Manufacturing Director'
 'Research Scientist' 'Healthcare Representative' 'Research Director'
 'Manager R&D' 'Finance Manager' 'Technical Architect' 'Business
Analvst'
 'Technical Lead' 'Delivery Manager']
BusinessTravelFrequency : ['Travel_Rarely' 'Travel_Frequently' 'Non-
Travel'1
categorical # All categorical features
['Gender',
 'EducationBackground',
 'MaritalStatus',
 'EmpDepartment',
 'EmpJobRole',
 'BusinessTravelFrequency'l
# Make a list of categorical feature and use sub plot to plot multiple
feature
categorical col =
data[['Gender','EducationBackground','MaritalStatus','BusinessTravelFr
equency','OverTime','Attrition']]
plt.figure(figsize=(20,22)) # defining canvas size
plotno = 1 # counter
for column in categorical col: # iteration of columns / acessing the
columns from count
    if plotno<=7: # set the limit
        plt.subplot(3,2,plotno) # # plotting 6 graphs (3-rows,2-
columns) ,plotnumber is for count
sns.countplot(x=categorical col[column],hue=data.PerformanceRating) #
Plotting count plots because the feature is categorical
        plt.xlabel(column,fontsize=20) # assigning name to x-axis and
font size is 20
        plt.ylabel('PerformanceRating')
    plotno+=1 # counter increment
plt.tight layout()
plt.show() # used to hide the storage loction
```



7. Relationship between Gender and performance rating

- Maximum no of male rated with 3 performance rating as well as in female also most of the feamle rated with 3 performance rating.
- four performance rating in both male & female is less

8. Relationship between EducationBackground and performance rating

- Maximum life sciences and medical education background employee rated with 3 performance rating
- life science and medical education background employee also rated with 2 & 4
 performance rating most of the time

9. Relationship between Marital Status and performance rating

- Most of the married employee rated with 3 performance rating as well as single and divorced marital status employee rated with 3 performance rating most of the time.
- In married marital status 2 performance rating emplyee is more than single or divorced.

10. Relationship between Business Travel Frequency and performance rating

- Maximum no of travel rarely employee has get 3 performance rating
- Those employee travel frequentaly this employee also rated with 2, 3, and 4

11. Relationship between Overtime and performance rating

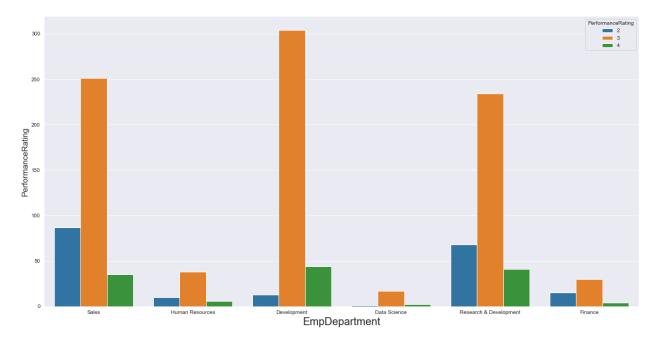
- Maximum no of employee with no overtime has rated with 3 performance rating
- Those employee doing overtime that time 2 & 4 performance rating is constant.

12. Relationship between Attrition and performance rating

- Most of the employee rated with 3 performance rating in no means(They are not leave the company)
- Those employee have 3 performace rating those also leave the company

13. Relationship between employee department and performance rating

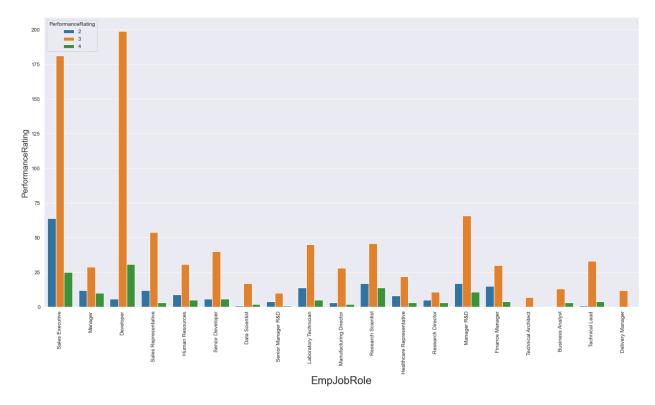
```
plt.figure(figsize=(20,10))
sns.countplot('EmpDepartment', hue=data.PerformanceRating, data=data)
plt.xlabel('EmpDepartment', fontsize=20)
plt.ylabel('PerformanceRating', fontsize=15)
plt.show()
```



- Most of the Development, Sales, And Research and development employee department has 3 performance rating
- Data science department employee has low performance rating.
- In sales & Research and development department also 2 performance rating employee avilable most of the time.

14. Relationship between employee job role and performance rating

```
plt.figure(figsize=(20,10))
sns.countplot('EmpJobRole',hue=data.PerformanceRating,data=data)
plt.xticks(rotation='vertical')
plt.xlabel('EmpJobRole',fontsize=20)
plt.ylabel('PerformanceRating',fontsize=15)
plt.show()
```



- Developers and sales executive job role employee performance rating is 3 most of the time.
- In technical architecture and delivery manger job role employee not rated with 2 & 4 performance rating.
- In sales excutive alsso less than 60 employee rated with 2 performance rating.
- Remaining all job role employee has 3 performance rating most of the time.

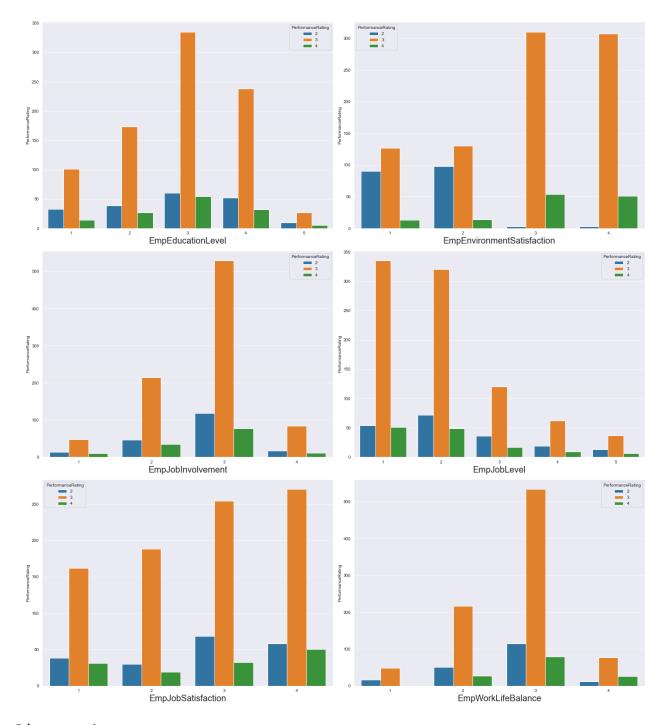
CREATE NEW DATAFRMAE FOR NUMERICAL FEATURES:

```
numerical_col = []
for column in data.columns:
    if data[column].dtype == "int64":
        data[column].unique()  # for continuos features we use
unique>=10
        numerical_col.append(column)

numerical_col  # All numerical features

['Age',
    'DistanceFromHome',
    'EmpEducationLevel',
    'EmpEnvironmentSatisfaction',
    'EmpHourlyRate',
    'EmpJobInvolvement',
    'EmpJobSatisfaction',
```

```
'NumCompaniesWorked',
 'EmpLastSalaryHikePercent',
 'EmpRelationshipSatisfaction',
 'TotalWorkExperienceInYears',
 'TrainingTimesLastYear',
 'EmpWorkLifeBalance',
 'ExperienceYearsAtThisCompany',
 'ExperienceYearsInCurrentRole',
 'YearsSinceLastPromotion',
 'YearsWithCurrManager',
 'PerformanceRating']
numerical =
data[['EmpEducationLevel','EmpEnvironmentSatisfaction','EmpJobInvolvem
ent','EmpJobLevel','EmpJobSatisfaction',
                 'EmpWorkLifeBalance']]
plt.figure(figsize=(20,22)) # defining canvas size
plotno = 1 # counter
for column in numerical: # iteration of columns / acessing the columns
from count
    if plotno<=7: # set the limit
        plt.subplot(3,2,plotno) # # plotting 6 graphs (3-rows,2-
columns) , plotnumber is for count
        sns.countplot(x=numerical[column], hue=data.PerformanceRating)
# Plotting count plots because the feature is categorical
        plt.xlabel(column, fontsize=20) # assigning name to x-axis and
font size is 20
        plt.ylabel('PerformanceRating')
    plotno+=1 # counter increment
plt.tight layout()
plt.show() # used to hide the storage loction
```



15. Relationship between EmpEducationLevel and performance rating

- Those employee education level is [3,4 & 2] this employee have 3 performance rating mostly
- If the performance rating is 2 & 4 then all eduaction level employee is less than 60.

16. Relationship between EmpEnvironmentSatisfaction and performance rating

- Maximum no of employee enviorment statifaction is 3 and 4 with 3 performance rating.
- If the employee enviorment satisfaction is 1 & 2 that time the maximum employee have 2 performace rating.
- If the employee enviorment satisfaction is increases that time 4 performance rating also increases.

17. Relationship between EmpJobInvolvement and performance rating

- Those employee job involvement is 2 & 3 this empluee have 3 performance rating mostly
- 2 & 4 performance rating eployee is less in all job involvment.

18. Relationship between EmpJobLevel and performance rating

- If the employee job level is 1,2 & 3 that time most of the employee have 3 performance rating
- In all job levels 2 & 4 performance rating of all emplyee is less than 60.

19. Relationship between EmpJobSatisfaction and performance rating

- Maximum 4 & 3 job satisfaction employee get 3 performance rating most of the time.
- In all job satisfaction 2 & 4 performance rating is less than 55 employee

21. Relationship between EmpWorkLifeBalance and performance rating

- If the employee work life balance is 3 that time maximum no of employee have 3 performance rating.
- If the work life balance is 1 that time no one get 4 performance rating.

MULTIVARIATE ANALYSIS

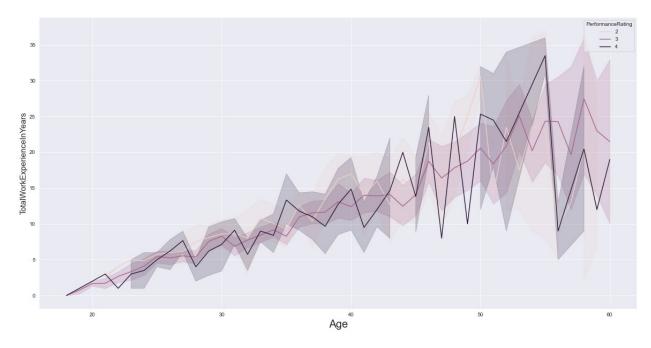
• Checking the relationship between two features with respect to target features

PLOT USED:

Line plot: A Line plot can be defined as a graph that displays data as points or check marks above a number line, showing the frequency of each value. **Barplot:** It shows the relationship between a numeric and a categoric variable. Each entity of the categoric variable is represented as a bar. The size of the bar represents its numeric value.

1.Check the relationship between Age & Total work experiance with respect to target feature

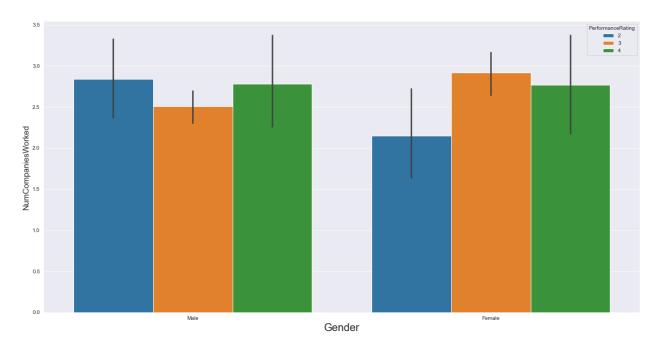
```
plt.figure(figsize=(20,10))
sns.lineplot(x='Age',y='TotalWorkExperienceInYears',hue=data.Performan
ceRating,data=data)
plt.xlabel('Age',fontsize=20)
plt.ylabel('TotalWorkExperienceInYears',fontsize=15)
plt.show()
```



- If the age & total experiance is increases that time most of the employee performance rating is 4.
- Low age and minimum year experiance employee also 4 perforace rating.
- At the age of 50 and 30 years of experiance employee have 2 performance rating.

2.Check the relationship between Gender & Number Companies Worked with respect to target feature

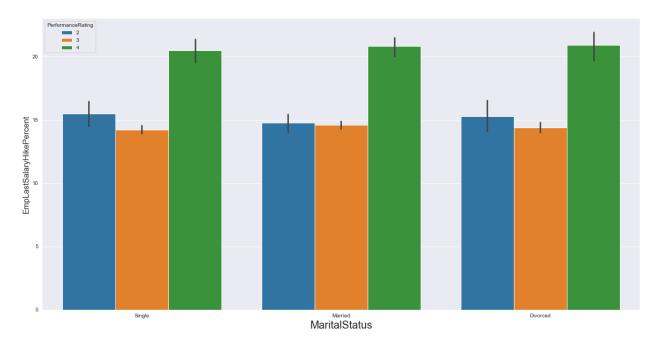
```
plt.figure(figsize=(20,10))
sns.barplot(x='Gender',y='NumCompaniesWorked',hue=data.PerformanceRati
ng,data=data)
plt.xlabel('Gender',fontsize=20)
plt.ylabel('NumCompaniesWorked',fontsize=15)
plt.show()
```



- If the gender is male and no of companies work is increses that time most of the performance rating is 2 & 4.
- If female work in less no companies that time performance rating is 2.
- 3 & 4 performance rating in female increase if the no of compaines worked is increses.

3.Check the relationship between MaritalStatus & EmpLastSalaryHikePercent with respect to target feature

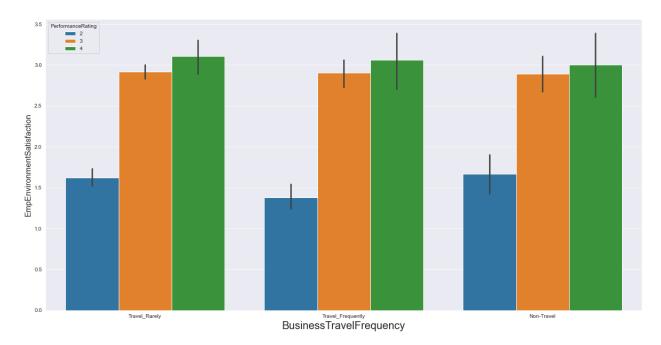
```
plt.figure(figsize=(20,10))
sns.barplot(x='MaritalStatus',y='EmpLastSalaryHikePercent',hue=data.Pe
rformanceRating,data=data)
plt.xlabel('MaritalStatus',fontsize=20)
plt.ylabel('EmpLastSalaryHikePercent',fontsize=15)
plt.show()
```



- In all marital status with maximum salary hike percent in last year is increases that time performance rating is 4.
- If salary hike percentage in last year is less than 15 that time performance rating is 2 & 3 in all marital status.

4.Check the relationship between BusinessTravelFrequency & EmpEnvironmentSatisfaction with respect to target feature

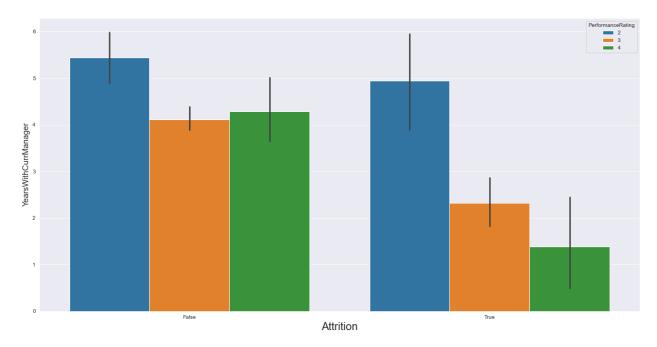
```
plt.figure(figsize=(20,10))
sns.barplot(x='BusinessTravelFrequency',y='EmpEnvironmentSatisfaction'
,hue=data.PerformanceRating,data=data)
plt.xlabel('BusinessTravelFrequency',fontsize=20)
plt.ylabel('EmpEnvironmentSatisfaction',fontsize=15)
plt.show()
```



- If the employee enviorment satisfaction is high that time performance rating is 3 & 4 in all buisness travel frequency.
- Low employee enviorment satisfaction has 2 performance rating in all buisness travel frequency.

5.Check the relationship between Attrition & YearsWithCurrManager with respect to target feature

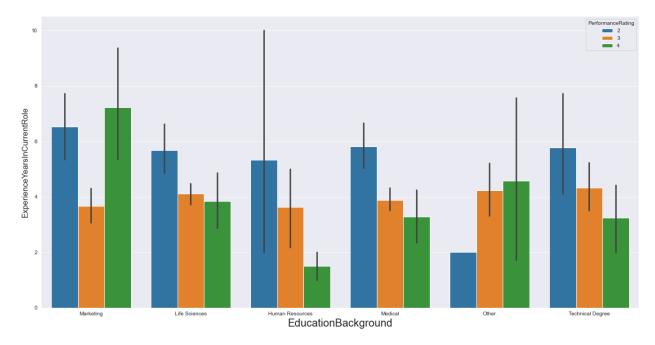
```
plt.figure(figsize=(20,10))
sns.barplot(x='Attrition',y='YearsWithCurrManager',hue=data.Performanc
eRating,data=data)
plt.xlabel('Attrition',fontsize=20)
plt.ylabel('YearsWithCurrManager',fontsize=15)
plt.show()
```



- If the employee current manager year is increses that time performance rating is 2 and 50-50% chances of employee to leave the company.
- those employee perfomance rating is 4 and current manger year is increases that time most of the employee not leave the company.

6.Check the relationship between EducationBackground & ExperienceYearsInCurrentRole with respect to target feature

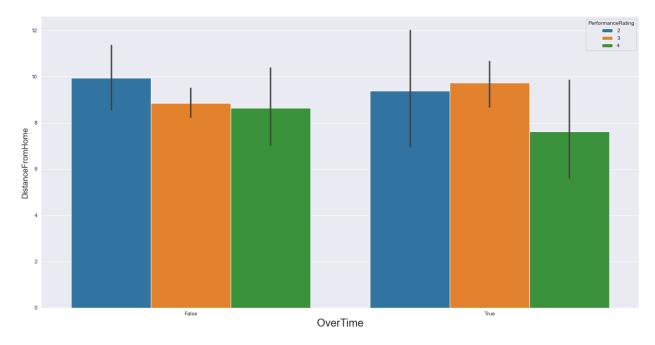
```
plt.figure(figsize=(20,10))
sns.barplot(x='EducationBackground',y='ExperienceYearsInCurrentRole',h
ue=data.PerformanceRating,data=data)
plt.xlabel('EducationBackground',fontsize=20)
plt.ylabel('ExperienceYearsInCurrentRole',fontsize=15)
plt.show()
```



- If the current role experiance is increses of marketing education background employee has 4 performance rating most of the time
- In all education background with current role experiance is more than 5 then the performance rating of employee is 2.
- Life scineces, Medical, others, and technical degree education background employee has less than 4 year of experiance in current role that time performance rating is 3 & 4.

7.Check the relationship between OverTime & DistanceFromHome with respect to target feature

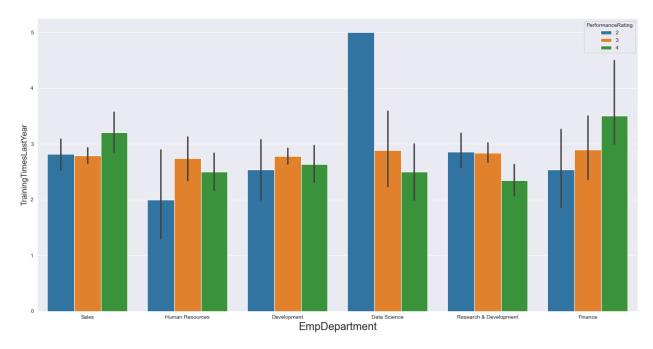
```
plt.figure(figsize=(20,10))
sns.barplot(x='OverTime',y='DistanceFromHome',hue=data.PerformanceRati
ng,data=data)
plt.xlabel('OverTime',fontsize=20)
plt.ylabel('DistanceFromHome',fontsize=15)
plt.show()
```



• If the distance from home is increses that time performance rating is constant with employee doing overtime as well as not doing overtime.

8.Check the relationship between EmpDepartment & TrainingTimesLastYear with respect to target feature

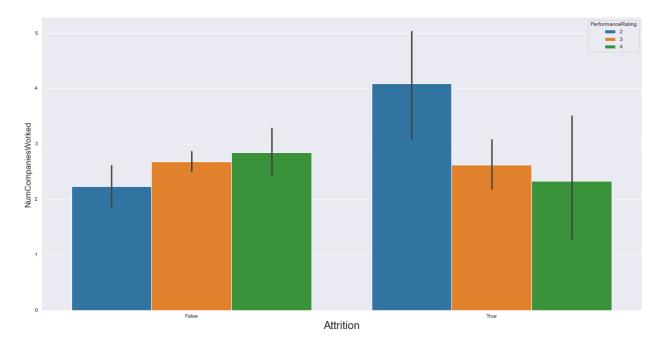
```
plt.figure(figsize=(20,10))
sns.barplot(x='EmpDepartment',y='TrainingTimesLastYear',hue=data.Perfo
rmanceRating,data=data)
plt.xlabel('EmpDepartment',fontsize=20)
plt.ylabel('TrainingTimesLastYear',fontsize=15)
plt.show()
```



- If the employee from data science department and most training time in last year then the performance rating is 2 maximum time.
- Other all employee department with less than 3 time training in last year then the peroformance rating is constant.

10.Check the relationship between Attrition & NumCompaniesWorked with respect to target feature

```
plt.figure(figsize=(20,10))
sns.barplot(x='Attrition',y='NumCompaniesWorked',hue=data.PerformanceR
ating,data=data)
plt.xlabel('Attrition',fontsize=20)
plt.ylabel('NumCompaniesWorked',fontsize=15)
plt.show()
```



- If emplyee number of companies worked is increses that time most of the employee leave the company and their performance rating is 2
- Those employee have work in less no of companies they are not leave the company and their performance rating is constant.

CONCLUSION

 There are some features are positively correlated with performance rating (Target variable) [Emp Environment Satisfaction, Emp Last Salary Hike Percent, Emp Work Life Balance]