```
In [161... #import basic libraries
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

## Import the three datasets

```
In [162...
           #LOADING FIRST DATA
           df_user=pd.read_csv('users.dat',sep="::",names=['UserID','Gender','Age','Occupation
           df_user
In [163...
                 UserID Gender Age Occupation Zip Code
Out[163]:
              0
                      1
                              F
                                   1
                                              10
                                                    48067
                      2
                                                    70072
                                  56
                                              16
              2
                      3
                             Μ
                                  25
                                              15
                                                    55117
                                               7
                                  45
                                                    02460
              4
                      5
                             Μ
                                  25
                                              20
                                                    55455
           6035
                   6036
                              F
                                  25
                                              15
                                                    32603
           6036
                   6037
                                  45
                                               1
                                                    76006
           6037
                   6038
                              F
                                               1
                                                    14706
                                  56
           6038
                   6039
                                  45
                                                    01060
           6039
                   6040
                             Μ
                                  25
                                               6
                                                    11106
          6040 rows × 5 columns
 In [164...
           #LOADING SECOND DATA
           df_movies=pd.read_csv('movies.dat',sep="::",names=['MovieID','Title','Generes'],eng
 In [165...
           df movies
```

Out[165]:	M	ovieID			Title	Generes
	0	1		Toy St	ory (1995)	Animation Children's Comedy
	1	2		Juma	anji (1995)	Adventure Children's Fantasy
	2	3	Grump	oier Old M	1en (1995)	Comedy Romance
	3	4	Waiti	ng to Exh	nale (1995)	Comedy Drama
	4	5 F	ather of the	Bride Pa	rt II (1995)	Comedy
	3878	3948	Mee	t the Pare	ents (2000)	Comedy
	3879	3949	Requiem	iem for a Dream (2000)		Drama
	3880	3950		Tigerla	and (2000)	Drama
	3881	3951	Two F	amily Ho	use (2000)	Drama
	3882	3952	Co	ntender, <sup>-</sup>	The (2000)	Drama Thriller
	3883 row	s × 3 col	umns			
In [166	#LOADING df_ratin df_ratin	ngs=pd.r		'rating	s.dat',se	p="::",names=['UserID',
Out[166]:		UserID	MovielD	Rating	Timestam	p
	0	1	1193	5	97830076	0
	0		1193 661	5 3	97830076 97830210	
		1				9
	1	1	661	3	97830210	9
	1	1	661 914	3	97830210 97830196	9 8 5
	1 2 3	1 1 1	661 914 3408	3 3 4	978302100 978301960 97830027 97882429	9 8 5
	1 2 3 4	1 1 1	661 914 3408 2355	3 3 4 5	978302100 978301960 97830027 97882429	9 8 5 1
	1 2 3 4	1 1 1 1	661 914 3408 2355 	3 3 4 5 	97830210 97830196 97830027 97882429	9 8 5 1 
	1 2 3 4  1000204	1 1 1 1 	661 914 3408 2355  1091	3 3 4 5 	97830210 97830196 97830027 97882429  95671654	9 8 5 1  1
	1 2 3 4  1000204 1000205	1 1 1  6040 6040	661 914 3408 2355  1091 1094	3 3 4 5  1 5	97830210 97830196 97830027 97882429  95671654 95670488	9 8 5 1  1 7
	1 2 3 4  1000204 1000205 1000206	1 1 1  6040 6040 6040	661 914 3408 2355  1091 1094 562	3 3 4 5  1 5 5	97830210 97830196 97830027 97882429  95671654 95670488 95670474	9 8 5 1  1 7 6 8
	1 2 3 4 1000204 1000205 1000206 1000207	1 1 1 1  6040 6040 6040 6040	661 914 3408 2355  1091 1094 562 1096 1097	3 3 4 5  1 5 5	978302100 978301960 978300270 97882429 95671654 95670488 956704740 956715640	9 8 5 1  1 7 6 8
In [167	1 2 3 4 1000204 1000205 1000206 1000207 1000208	1 1 1  6040 6040 6040 6040 rows × 4	661 914 3408 2355  1091 1094 562 1096 1097	3 3 4 5  1 5 5	978302100 978301960 978300270 97882429 95671654 95670488 956704740 956715640	9 8 5 1  1 7 6 8
In [167 Out[167]:	1 2 3 4 1000204 1000205 1000206 1000207 1000208 1000209	1 1 1 1 6040 6040 6040 6040 rows × 4	661 914 3408 2355  1091 1094 562 1096 1097	3 3 4 5  1 5 5	978302100 978301960 978300270 97882429 95671654 95670488 956704740 956715640	9 8 5 1  1 7 6 8
-	1 2 3 4 1000204 1000205 1000206 1000207 1000208 1000209 df_user	1 1 1 1 6040 6040 6040 6040 rows × 4shape	661 914 3408 2355  1091 1094 562 1096 1097	3 3 4 5  1 5 5	978302100 978301960 978300270 97882429 95671654 95670488 956704740 956715640	9 8 5 1  1 7 6 8

In [169... df\_ratings.shape

In [173... dfMaster

Create a new dataset [Master\_Data] with the following columns MovieID Title UserID Age Gender Occupation Rating. (Hint: (i) Merge two tables at a time. (ii) Merge the tables using two primary keys MovieID & UserId)

171	dfMovieRatings									
171]:		MovieID	Title	Generes	UserID	Rating	Timestamp			
	0	1	Toy Story (1995)	Animation Children's Comedy	1	5	978824268			
	1	1	Toy Story (1995)	Animation Children's Comedy	6	4	978237008			
	<b>2</b> 1		Toy Story (1995)	Animation Children's Comedy	8	4	978233496			
	3	1	Toy Story (1995)	Animation Children's Comedy	9	5	978225952			
	4	1	Toy Story (1995)	Animation Children's Comedy	10	5	978226474			
	<b></b>									
	1000204	3952	Contender, The (2000)	Drama Thriller	5812	4	992072099			
	1000205	3952	Contender, The (2000)	Drama Thriller	5831	3	986223125			
	1000206	3952	Contender, The (2000)	Drama Thriller	5837	4	1011902656			
	1000207	3952	Contender, The (2000)	Drama Thriller	5927	1	979852537			
	1000208	3952	Contender, The (2000)	Drama Thriller	5998	4	1001781044			
	1000209 r	ows × 6 cc	lumns							

Out[173]:		MovielD	Title	Generes	UserID	Rating	Timestamp
	0	1	Toy Story (1995)	Animation Children's Comedy	1	5	978824268
	1	48	Pocahontas (1995)	Animation Children's Musical Romance	1	5	978824351
	2	150	Apollo 13 (1995)	Drama	1	5	978301777
	3	260	Star Wars: Episode IV - A New Hope (1977)	Action   Adventure   Fantasy   Sci-Fi	1	4	978300760
	4	527	Schindler's List (1993)	Drama War	1	5	978824195
	1000204	3513	Rules of Engagement (2000)	Drama Thriller	5727	4	958489970
	1000205	3535	American Psycho (2000)	Comedy Horror Thriller	5727	2	958489970
	1000206	3536	Keeping the Faith (2000)	Comedy Romance	5727	5	958489902
	1000207	3555	U-571 (2000)	Action Thriller	5727	3	958490699
	1000208	3578	Gladiator (2000)	Action Drama	5727	5	958490171

1000209 rows × 10 columns

(2000)

```
In [174... #saving the file to csv
dfMaster.to_csv('Master Data.csv')
In [175... dfMaster.isnull().sum().any()
Out[175]:
False
```

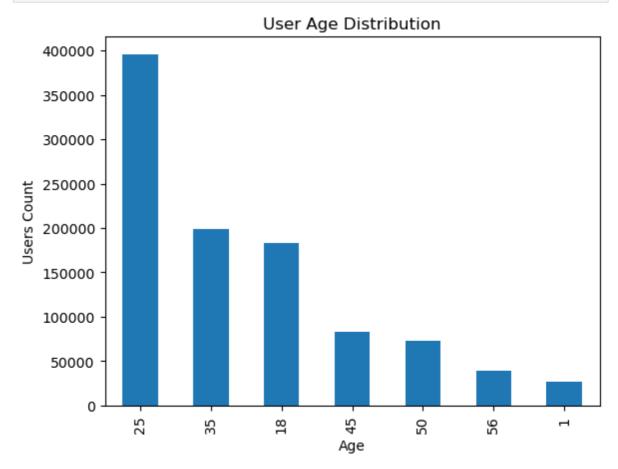
# Explore the datasets using visual representations (graphs or tables), also include your comments on the following:

#### **User Age Distribution**

```
In [176... # WE CAN PLOT THE CHARTS BY VALUE_COUNTS
    dfMaster['Age'].value_counts().plot(kind='bar')
    plt.title('User Age Distribution')
    plt.ylabel('Users Count')
```

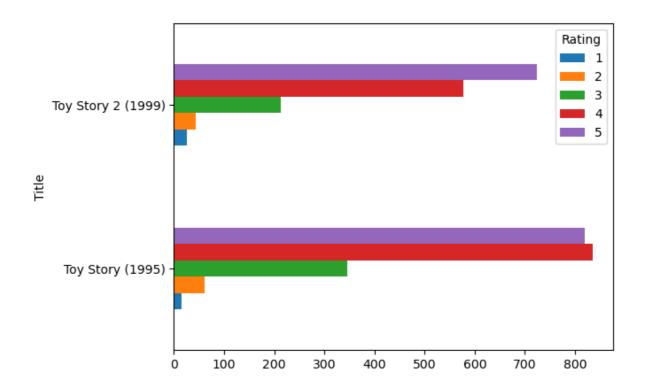
```
plt.xlabel('Age')
plt.show()

#conclusion = we can see user count mostly belongs to 18-25 age group
```



#### User rating of the movie "Toy Story"

```
toystory=dfMaster[dfMaster['Title'].str.contains('Toy Story')==True]
 In [177...
           toystory.groupby(['Title','Rating']).size()
 In [178...
           Title
                                Rating
Out[178]:
           Toy Story (1995)
                                            16
                                1
                                2
                                            61
                                3
                                          345
                                4
                                          835
                                          820
           Toy Story 2 (1999)
                                1
                                            25
                                           44
                                3
                                          214
                                4
                                          578
                                5
                                          724
           dtype: int64
           toystory.groupby(['Title','Rating']).size().unstack().plot(kind='barh')
 In [179...
           <AxesSubplot:ylabel='Title'>
Out[179]:
```



Top 25 movies by viewership rating

In [180	dfMovieRatings					
Out[180]:	MovielD	Title	Generes	UserID	Rating	Timestamp

	MovielD	Title	Generes	UserID	Rating	Timestamp
0	1	Toy Story (1995)	Animation Children's Comedy	1	5	978824268
1	1	Toy Story (1995)	Animation Children's Comedy	6	4	978237008
2	1	Toy Story (1995)	Animation Children's Comedy	8	4	978233496
3	1	Toy Story (1995)	Animation Children's Comedy	9	5	978225952
4	1	Toy Story (1995)	Animation Children's Comedy	10	5	978226474
1000204	3952	Contender, The (2000)	Drama Thriller	5812	4	992072099
1000205	3952	Contender, The (2000)	Drama Thriller	5831	3	986223125
1000206	3952	Contender, The (2000)	Drama Thriller	5837	4	1011902656
1000207	3952	Contender, The (2000)	Drama Thriller	5927	1	979852537
1000208	3952	Contender, The (2000)	Drama Thriller	5998	4	1001781044

1000209 rows × 6 columns

```
In [181... #Top 25 movies by viewership rating
    dfTop25=dfMaster.groupby('Title').size().sort_values(ascending=False)[:25]
    dfTop25
```

```
Out[181]: Title
          American Beauty (1999)
                                                                     3428
           Star Wars: Episode IV - A New Hope (1977)
                                                                     2991
           Star Wars: Episode V - The Empire Strikes Back (1980)
                                                                     2990
           Star Wars: Episode VI - Return of the Jedi (1983)
                                                                     2883
           Jurassic Park (1993)
                                                                     2672
           Saving Private Ryan (1998)
                                                                     2653
           Terminator 2: Judgment Day (1991)
                                                                     2649
          Matrix, The (1999)
                                                                     2590
           Back to the Future (1985)
                                                                     2583
           Silence of the Lambs, The (1991)
                                                                     2578
          Men in Black (1997)
                                                                     2538
           Raiders of the Lost Ark (1981)
                                                                     2514
           Fargo (1996)
                                                                     2513
           Sixth Sense, The (1999)
                                                                     2459
           Braveheart (1995)
                                                                     2443
           Shakespeare in Love (1998)
                                                                     2369
           Princess Bride, The (1987)
                                                                     2318
           Schindler's List (1993)
                                                                     2304
           L.A. Confidential (1997)
                                                                     2288
           Groundhog Day (1993)
                                                                     2278
           E.T. the Extra-Terrestrial (1982)
                                                                     2269
           Star Wars: Episode I - The Phantom Menace (1999)
                                                                     2250
           Being John Malkovich (1999)
                                                                     2241
           Shawshank Redemption, The (1994)
                                                                     2227
           Godfather, The (1972)
                                                                     2223
          dtype: int64
 In [182... userId = 2696
           userRatingById = dfMaster[dfMaster["UserID"] == userId]
           userRatingById
```

Out[182]:		MovielD	Title	Generes	UserID	Rating	Timestamp	Gender
	991035	350	Client, The (1994)	Drama Mystery Thriller	2696	3	973308886	М
	991036	800	Lone Star (1996)	Drama Mystery	2696	5	973308842	М
	991037	1092	Basic Instinct (1992)	Mystery Thriller	2696	4	973308886	М
	991038	1097	E.T. the Extra- Terrestrial (1982)	Children's Drama Fantasy Sci- Fi	2696	3	973308690	М
	991039	1258	Shining, The (1980)	Horror	2696	4	973308710	М
	991040	1270	Back to the Future (1985)	Comedy Sci-Fi	2696	2	973308676	М
	991041	1589	Cop Land (1997)	Crime Drama Mystery	2696	3	973308865	М
	991042	1617	L.A. Confidential (1997)	Crime Film- Noir Mystery Thriller	2696	4	973308842	М
	991043	1625	Game, The (1997)	Mystery Thriller	2696	4	973308842	М
	991044	1644	l Know What You Did Last Summer (1997)	Horror Mystery Thriller	2696	2	973308920	М
	991045	1645	Devil's Advocate, The (1997)	Crime Horror Mystery Thriller	2696	4	973308904	М
	991046	1711	Midnight in the Garden of Good and Evil (1997)	Comedy Crime Drama Mystery	2696	4	973308904	М
	991047	1783	Palmetto (1998)	Film-Noir Mystery Thriller	2696	4	973308865	М
	991048	1805	Wild Things (1998)	Crime Drama Mystery Thriller	2696	4	973308886	М
	991049	1892	Perfect Murder, A (1998)	Mystery Thriller	2696	4	973308904	М
	991050	2338	I Still Know What You Did Last Summer (1998)	Horror Mystery Thriller	2696	2	973308920	М

	MovielD	Title	Generes	UserID	Rating	Timestamp	Gender
991051	2389	Psycho (1998)	Crime Horror Thriller	2696	4	973308710	М
991052	2713	Lake Placid (1999)	Horror Thriller	2696	1	973308710	М
991053	3176	Talented Mr. Ripley, The (1999)	Drama Mystery Thriller	2696	4	973308865	М
991054	3386	JFK (1991)	Drama Mystery	2696	1	973308842	М
							•

### **Feature Engineering:**

Find out all the unique genres (Hint: split the data in column genre making a list and then process the data to find out only the unique categories of genres)

```
In [183... dfGeneres= dfMaster['Generes'].str.split('|')
In [184... listgeneres=set() #constructor method
    for genre in dfGeneres:
        listgeneres=listgeneres.union(set(genre))
In [185... len(listgeneres)
Out[185]:
```

Create a separate column for each genre category with a one-hot encoding (1 and 0) whether or not the movie belongs to that genre.

```
In [186... #non-splited element and doing encoding by column and row wise
GeneresOnehot=dfMaster['Generes'].str.get_dummies('|')
GeneresOnehot
```

		_			_	
$\cap$	n+	Γ1	Ω	6	Т.	0
$\cup$	u L	1 4	. О	U	-	

	Action	Adventure	Animation	Children's	Comedy	Crime	Documentary	Drama	Fant
0	0	0	1	1	1	0	0	0	
1	0	0	1	1	0	0	0	0	
2	0	0	0	0	0	0	0	1	
3	1	1	0	0	0	0	0	0	
4	0	0	0	0	0	0	0	1	
1000204	0	0	0	0	0	0	0	1	
1000205	0	0	0	0	1	0	0	0	
1000206	0	0	0	0	1	0	0	0	
1000207	1	0	0	0	0	0	0	0	
1000208	1	0	0	0	0	0	0	1	

1000209 rows × 18 columns

In [187... dfMaster=pd.concat([dfMaster,GeneresOnehot],axis=1)
 dfMaster

•	MovieID Title		Title	Generes	UserID	Rating	Timestamp
	<b>0</b> 1 Toy Story (1995)			Animation Children's Comedy	1	5	978824268
	1	48	Pocahontas (1995)	Animation Children's Musical Romance	1	5	978824351
	2	150	Apollo 13 (1995)	Drama	1	5	978301777
	3	Star Wars: Episode IV - A New Hope (1977)	Action   Adventure   Fantasy   Sci-Fi	1	4	978300760	
	4	527	Schindler's List (1993)	Drama War	1	5	978824195
	•••						
	1000204	3513	Rules of Engagement (2000)	Drama Thriller	5727	4	958489970
	1000205	3535	American Psycho (2000)	Comedy Horror Thriller	5727	2	958489970
	1000206	3536	Keeping the Faith (2000)	Comedy Romance	5727	5	958489902
	1000207	3555	U-571 (2000)	Action Thriller	5727	3	958490699
	1000208	3578	Gladiator (2000)	Action Drama	5727	5	958490171

1000209 rows × 28 columns

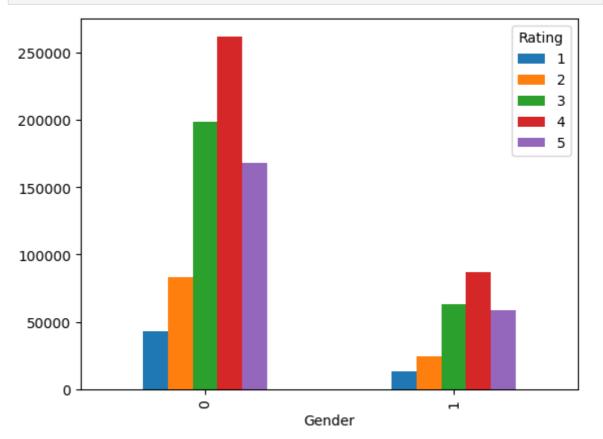
```
dfMaster['Gender']=dfMaster['Gender'].replace('M','0')
dfMaster['Gender']=dfMaster['Gender'].replace('F','1')
 In [188...
 In [189...
            dfMaster['Gender'].astype(int)
                          1
Out[189]:
                          1
            2
                         1
            3
                         1
            1000204
            1000205
                         0
            1000206
                         0
            1000207
                         0
            1000208
            Name: Gender, Length: 1000209, dtype: int32
            GenderAffecting=dfMaster.groupby('Gender').size().sort_values(ascending=False)
 In [190...
            GenderAffecting
```

Out[190]:

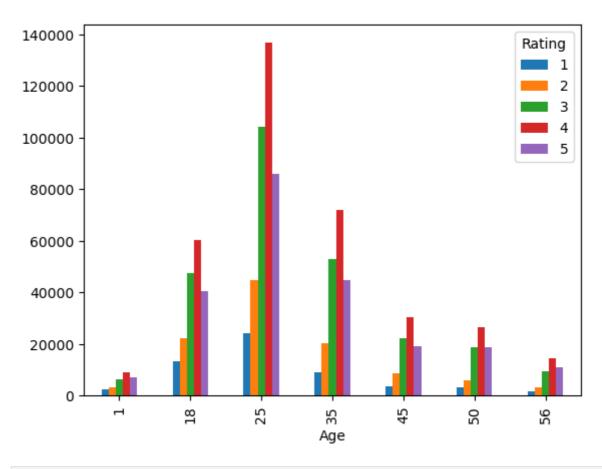
Gender 0 753769 1 246440 dtype: int64

# Determine the features affecting the ratings of any particular movie.

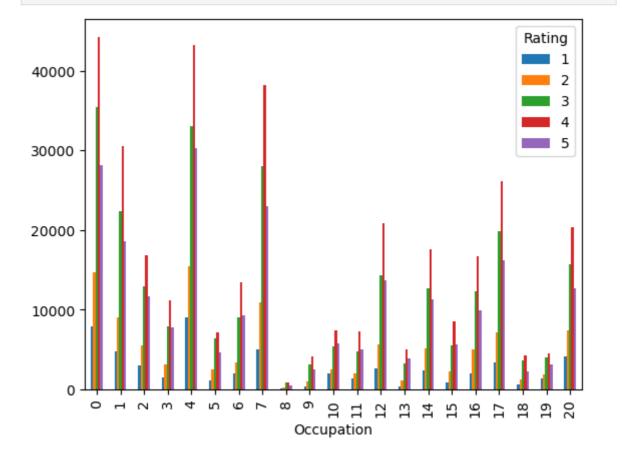
In [191... #relation between rating and gender
 dfMaster.groupby(['Gender', 'Rating']).size().unstack().plot(kind='bar',legend=True
 plt.show()



In [192... dfMaster.groupby(['Age','Rating']).size().unstack().plot(kind='bar',legend=True)
plt.show()



In [193... dfMaster.groupby(['Occupation','Rating']).size().unstack().plot(kind='bar',legend='
plt.show()



Develop an appropriate model to predict the movie ratings

```
In [194... #model building
           # first 500 records
           new_data=dfMaster[:500]
 In [195... features=new_data[['MovieID','Age','Occupation']].values
 In [196...
           labels=new_data[['Rating']].values
 In [197...
          from sklearn.model_selection import train_test_split
           #Create train and test data set
           train, test, train_labels, test_labels = train_test_split(features,labels,test_size
 In [198... from sklearn.ensemble import RandomForestClassifier
           random_forest = RandomForestClassifier(n_estimators=100)
           random_forest.fit(train, train_labels)
           Y_pred = random_forest.predict(test)
           random_forest.score(train, train_labels)
           acc_random_forest = round(random_forest.score(train, train_labels) * 100, 2)
           acc_random_forest
          C:\Users\rutuj\AppData\Local\Temp\ipykernel_19488\19447186.py:4: DataConversionWar
           ning: A column-vector y was passed when a 1d array was expected. Please change the
           shape of y to (n_samples,), for example using ravel().
            random_forest.fit(train, train_labels)
Out[198]:
  In [ ]:
  In [ ]:
```