Data Mining (DSC550-T301_2245_1)

Assignement Week 1; Author: Zemelak Goraga; Date: 03/16/2024

```
In [1]: # Step 1: Import necessary libraries
         import pandas as pd
In [4]: # Step 2: Load the dataset into a Pandas DataFrame and save it as df
         df = pd.read csv("Video Games Sales as at 22 Dec 2016.csv")
        # Step 3: Display the first ten rows of the df dataset
In [5]:
         print("First ten rows of the dataset:")
         print(df.head(10))
         First ten rows of the dataset:
                                  Name Platform Year of Release
                                                                            Genre
         0
                            Wii Sports Wii
                                                            2006.0
                                                                           Sports
         1
                    Super Mario Bros.
                                             NES
                                                            1985.0
                                                                         Platform
             Mario Naic .....
Wii Sports Resort Wii
Pokemon Red/Pokemon Blue GB
Tetris GB
         2
                                             Wii
                                                            2008.0
                                                                           Racing
         3
                                            Wii
                                                            2009.0
                                                                           Sports
         4
                                                            1996.0 Role-Playing
         5
                                                            1989.0
                                                                           Puzzle
                                             DS
         6
                New Super Mario Bros.
                                                            2006.0
                                                                         Platform
         7
                                            Wii
                              Wii Play
                                                                             Misc
                                                            2006.0
         8
           New Super Mario Bros. Wii
                                             Wii
                                                            2009.0
                                                                         Platform
         9
                             Duck Hunt
                                             NES
                                                            1984.0
                                                                          Shooter
           Publisher NA_Sales EU_Sales JP_Sales Other_Sales Global_Sales
        28.96 3.77

1 Nintendo 29.08 3.58 6.81

2 Nintendo 15.68 12.76 3.79

3 Nintendo 15.61 10.93 3.28

4 Nintendo 11.27 8.89 10.22

5 Nintendo 23.20 2.26 4.22

6 Nintendo 11.28 9.14 6.50

7 Nintendo 13.00
         0 Nintendo
                         41.36
                                    28.96
                                            3.77
                                                              8.45
                                                                            82.53
                                                              0.77
                                                                            40.24
                                                             3.29
                                                                            35.52
                                                             2.95
                                                                            32.77
                                                             1.00
                                                                            31.37
                                                             0.58
                                                                            30.26
                                  9.14 6.50
9.18 2.93
6.94 4.70
                                                             2.88
                                                                            29.80
         7 Nintendo 13.96
                                                             2.84
                                                                            28.92
         8 Nintendo
                      14.44
                                                             2.24
                                                                            28.32
         9 Nintendo
                         26.93
                                    0.63
                                                0.28
                                                              0.47
                                                                            28.31
            Critic_Score Critic_Count User_Score User_Count Developer Rating
         0
                    76.0
                                   51.0 8
                                                         322.0 Nintendo
                                                                                 Ε
         1
                     NaN
                                    NaN
                                               NaN
                                                             NaN
                                                                        NaN
                                                                               NaN
         2
                                                8.3
                    82.0
                                   73.0
                                                           709.0 Nintendo
                                                                               Ε
         3
                    80.0
                                   73.0
                                                8
                                                           192.0 Nintendo
                                                                                Ε
         4
                                    NaN
                                                NaN
                                                             NaN
                                                                               NaN
                     NaN
                                                                        NaN
         5
                     NaN
                                    NaN
                                                NaN
                                                             NaN
                                                                        NaN
                                                                               NaN
                                                8.5
                                                                                 Ε
         6
                    89.0
                                   65.0
                                                           431.0 Nintendo
         7
                    58.0
                                   41.0
                                                6.6
                                                         129.0 Nintendo
                                                                                 Ε
         8
                    87.0
                                   80.0
                                                8.4
                                                           594.0 Nintendo
                                                                                 Ε
                     NaN
                                    NaN
                                                NaN
                                                             NaN
                                                                        NaN
                                                                               NaN
         # Step 4: Display the columns of the df dataset
In [6]:
         print("\nColumns of the dataset:")
         print(df.columns)
         Columns of the dataset:
         Index(['Name', 'Platform', 'Year_of_Release', 'Genre', 'Publisher', 'NA_Sales',
                 'EU_Sales', 'JP_Sales', 'Other_Sales', 'Global_Sales', 'Critic_Score',
                 'Critic_Count', 'User_Score', 'User_Count', 'Developer', 'Rating'],
               dtype='object')
```

```
# Step 5: Find the dimensions (number of rows and columns) in the df data frame
In [7]:
         num_rows, num_cols = df.shape
         print(f"\nDimensions of the dataset: {num rows} rows x {num cols} columns")
         Dimensions of the dataset: 16719 rows x 16 columns
         # Step 6: Find the top five games by critic score
         top_games_by_critic_score = df.nlargest(5, 'Critic_Score')[['Name', 'Critic_Score']
         print("\nTop five games by critic score:")
         print(top_games_by_critic_score)
         Top five games by critic score:
                                   Name Critic Score
         51
                    Grand Theft Auto IV
                                                 98.0
         57
                    Grand Theft Auto IV
                                                 98.0
         227
               Tony Hawk's Pro Skater 2
                                                 98.0
         5350
                            SoulCalibur
                                                 98.0
                     Grand Theft Auto V
                                                 97.0
In [11]:
         # Step 7: Find the number of video games in the df data frame in each genre
         genre_counts = df['Genre'].value_counts()
         print("\nNumber of video games in each genre:")
         print(genre counts)
         Number of video games in each genre:
                         3370
         Action
                         2348
         Sports
         Misc
                         1750
         Role-Playing
                         1500
         Shooter
                         1323
         Adventure
                         1303
         Racing
                         1249
         Platform
                          888
         Simulation
                          874
                          849
         Fighting
         Strategy
                          683
                          580
         Puzzle
         Name: Genre, dtype: int64
In [13]: # Step 8: Find the first five games in the df data frame on the SNES platform
         snes_games = df[df['Platform'] == 'SNES'].head(5)
         print("\nFirst five games on the SNES platform:")
         print(snes games)
```

```
Name Platform Year_of_Release
                                                                                   Genre
         18
                                  Super Mario World
                                                        SNES
                                                                        1990.0 Platform
         56
                              Super Mario All-Stars
                                                        SNES
                                                                        1993.0 Platform
         71
                                Donkey Kong Country
                                                                        1994.0 Platform
                                                        SNES
         76
                                   Super Mario Kart
                                                        SNES
                                                                        1992.0
                                                                                  Racing
         137 Street Fighter II: The World Warrior
                                                        SNES
                                                                        1992.0 Fighting
             Publisher
                        NA Sales EU Sales JP Sales Other Sales Global Sales \
         18
              Nintendo
                            12.78
                                       3.75
                                                 3.54
                                                               0.55
         56
              Nintendo
                             5.99
                                       2.15
                                                 2.12
                                                               0.29
                                                                            10.55
         71
              Nintendo
                             4.36
                                       1.71
                                                 3.00
                                                               0.23
                                                                             9.30
         76
              Nintendo
                             3.54
                                       1.24
                                                 3.81
                                                               0.18
                                                                             8.76
         137
                                                 2.87
                                                                             6.30
                Capcom
                             2.47
                                       0.83
                                                               0.12
              Critic_Score
                            Critic_Count User_Score User_Count Developer Rating
         18
                                                                               NaN
                        NaN
                                      NaN
                                                 NaN
                                                              NaN
                                                                        NaN
         56
                        NaN
                                      NaN
                                                 NaN
                                                              NaN
                                                                        NaN
                                                                               NaN
         71
                        NaN
                                      NaN
                                                 NaN
                                                              NaN
                                                                        NaN
                                                                               NaN
         76
                        NaN
                                      NaN
                                                 NaN
                                                              NaN
                                                                        NaN
                                                                               NaN
         137
                        NaN
                                      NaN
                                                 NaN
                                                              NaN
                                                                        NaN
                                                                               NaN
         # Step 9: Find the five publishers with the highest total global sales
In [15]:
          publisher sales = df.groupby('Publisher')['Global Sales'].sum().nlargest(5)
          print("\nFive publishers with the highest total global sales:")
         print(publisher_sales)
         Five publishers with the highest total global sales:
         Publisher
         Nintendo
                                         1788.81
         Electronic Arts
                                         1116.96
         Activision
                                          731.16
         Sony Computer Entertainment
                                          606.48
                                          471.61
         Ubisoft
         Name: Global Sales, dtype: float64
         # Step 10: Create a new column for the percentage of global sales from North Americ
In [16]:
         df['NA_Sales_Percentage'] = (df['NA_Sales'] / df['Global_Sales']) * 100
         # Step 11: Display the first five rows of the new DataFrame
In [17]:
          print("\nFirst five rows with the new column:")
         print(df.head())
         First five rows with the new column:
                                 Name Platform Year_of_Release
                                                                         Genre Publisher \
         0
                                           Wii
                           Wii Sports
                                                          2006.0
                                                                        Sports Nintendo
         1
                    Super Mario Bros.
                                           NES
                                                          1985.0
                                                                      Platform
                                                                                Nintendo
         2
                       Mario Kart Wii
                                           Wii
                                                          2008.0
                                                                        Racing
                                                                                Nintendo
         3
                   Wii Sports Resort
                                           Wii
                                                          2009.0
                                                                        Sports
                                                                                Nintendo
           Pokemon Red/Pokemon Blue
                                            GB
                                                          1996.0 Role-Playing
                                                                                Nintendo
                                 JP Sales Other Sales Global Sales Critic Score
            NA Sales
                      EU Sales
         0
               41.36
                          28.96
                                     3.77
                                                  8.45
                                                                82.53
                                                                               76.0
                                                  0.77
                                                                40.24
                                                                                NaN
         1
               29.08
                           3.58
                                     6.81
         2
               15.68
                          12.76
                                     3.79
                                                                35.52
                                                                               82.0
                                                  3.29
         3
               15.61
                          10.93
                                     3.28
                                                  2.95
                                                                32.77
                                                                               80.0
         4
               11.27
                           8.89
                                    10.22
                                                  1.00
                                                                31.37
                                                                                NaN
            Critic_Count User_Score User_Count Developer Rating NA_Sales_Percentage
         0
                     51.0
                                  8
                                           322.0 Nintendo
                                                                Ε
                                                                              50.115110
         1
                     NaN
                                 NaN
                                             NaN
                                                       NaN
                                                               NaN
                                                                              72.266402
         2
                     73.0
                                 8.3
                                           709.0
                                                  Nintendo
                                                                Ε
                                                                              44.144144
         3
                                                                Ε
                     73.0
                                   8
                                           192.0 Nintendo
                                                                              47.635032
         4
                     NaN
                                 NaN
                                             NaN
                                                       NaN
                                                               NaN
                                                                              35.926044
```

First five games on the SNES platform:

```
In [18]:
        # Step 12: Find the number of NaN entries in each column
         nan_counts = df.isna().sum()
         print("\nNumber of NaN entries in each column:")
         print(nan_counts)
         Number of NaN entries in each column:
         Name
         Platform
                                   0
         Year_of_Release
                               269
         Genre
                                  2
         Publisher
                                 54
         NA Sales
                                  0
         EU Sales
                                  0
         JP_Sales
                                  0
                            0
0
8582
8582
6704
9129
         Other_Sales
         Global Sales
         Critic_Score
         Critic_Count
         User_Score
         User_Count
         Developer
                              6623
         Rating
                               6769
         NA_Sales_Percentage
                                   0
         dtype: int64
In [19]: # Step 13: Replace non-numerical user score entries with NaN
         df['User_Score'] = pd.to_numeric(df['User_Score'], errors='coerce')
In [21]: # Step 14: Calculate the median user score
         median_user_score = df['User_Score'].median()
         median_user_score
         7.5
Out[21]:
In [22]: # Step 15: Replace NaN entries in the user score column with the median value
         df['User_Score'].fillna(median_user_score, inplace=True)
In [24]: # Step 16: Display the updated DataFrame
         print("\nUpdated DataFrame with NaN replaced:")
         print(df)
```

```
Updated DataFrame with NaN replaced:
                                  Name Platform Year_of_Release
                                                                            Genre
0
                           Wii Sports
                                                            2006.0
                                                                           Sports
                                             Wii
1
                    Super Mario Bros.
                                             NES
                                                            1985.0
                                                                         Platform
2
                       Mario Kart Wii
                                             Wii
                                                            2008.0
                                                                           Racing
3
                    Wii Sports Resort
                                             Wii
                                                            2009.0
                                                                           Sports
4
            Pokemon Red/Pokemon Blue
                                                            1996.0 Role-Playing
                                              GB
16714
       Samurai Warriors: Sanada Maru
                                             PS3
                                                            2016.0
                                                                           Action
16715
                     LMA Manager 2007
                                           X360
                                                            2006.0
                                                                           Sports
16716
             Haitaka no Psychedelica
                                             PSV
                                                            2016.0
                                                                        Adventure
16717
                     Spirits & Spells
                                             GBA
                                                            2003.0
                                                                         Platform
16718
                  Winning Post 8 2016
                                             PSV
                                                            2016.0
                                                                      Simulation
                                                      Other_Sales Global Sales
                      NA_Sales
                                EU_Sales
                                            JP Sales
          Publisher
0
           Nintendo
                         41.36
                                    28.96
                                                3.77
                                                              8.45
                                                                            82.53
1
                         29.08
                                     3.58
                                                              0.77
                                                                            40.24
           Nintendo
                                                6.81
2
           Nintendo
                         15.68
                                    12.76
                                                3.79
                                                              3.29
                                                                            35.52
3
           Nintendo
                         15.61
                                    10.93
                                                3.28
                                                              2.95
                                                                            32.77
4
           Nintendo
                         11.27
                                     8.89
                                               10.22
                                                              1.00
                                                                            31.37
                           . . .
                                      . . .
                                                 . . .
                                                               . . .
         Tecmo Koei
                          0.00
16714
                                     0.00
                                                0.01
                                                              0.00
                                                                             0.01
16715
        Codemasters
                          0.00
                                     0.01
                                                0.00
                                                              0.00
                                                                             0.01
16716
       Idea Factory
                          0.00
                                     0.00
                                                0.01
                                                              0.00
                                                                             0.01
                                                0.00
                                                              0.00
16717
                          0.01
                                     0.00
                                                                             0.01
            Wanadoo
16718
                          0.00
                                     0.00
                                                0.01
                                                              0.00
         Tecmo Koei
                                                                             0.01
       Critic_Score Critic_Count
                                     User_Score User_Count Developer Rating
0
                76.0
                               51.0
                                             8.0
                                                        322.0
                                                              Nintendo
                                                                              Ε
1
                                             7.5
                                                                            NaN
                 NaN
                               NaN
                                                          NaN
                                                                    NaN
2
                82.0
                                                       709.0 Nintendo
                                                                              Е
                               73.0
                                             8.3
3
                80.0
                               73.0
                                             8.0
                                                       192.0
                                                              Nintendo
                                                                              Ε
4
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
                                                                            NaN
                 . . .
                                                          . . .
                                                                     . . .
16714
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
                                                                            NaN
16715
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
                                                                            NaN
                                                                            NaN
16716
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
16717
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
                                                                            NaN
16718
                 NaN
                                NaN
                                             7.5
                                                          NaN
                                                                    NaN
                                                                            NaN
       NA Sales Percentage
0
                  50.115110
1
                  72.266402
2
                  44.144144
3
                  47.635032
4
                  35.926044
. . .
                        . . .
16714
                   0.000000
16715
                   0.000000
16716
                   0.000000
                 100.000000
16717
                   0.000000
16718
[16719 rows x 17 columns]
```

Title: Comprehensive Analysis of Video Game Sales with Ratings Dataset

In []:

Summary: This report provides a comprehensive analysis of the Video Game Sales with Ratings dataset, focusing on various aspects such as top games by critic score, genre distribution, publisher sales, and user score data wrangling. Through thorough examination

and analysis, valuable insights into the video game industry are derived, aiding stakeholders in making informed decisions.

Introduction: The video game industry has witnessed exponential growth over the years, with the rise of various platforms and genres catering to diverse audiences. Understanding the dynamics of this industry is crucial for stakeholders, including developers, publishers, and investors. The Video Game Sales with Ratings dataset offers a wealth of information that can be leveraged to gain insights into consumer preferences, market trends, and more.

Statement of the Problem: The dataset presents several challenges and opportunities for analysis. Key issues include missing data entries, inconsistent formats, and the need to derive meaningful insights from the available information. The goal is to extract actionable insights that can inform business strategies and decision-making processes.

Methodology:

Data Acquisition: The dataset was obtained from Kaggle using the Kaggle API. Data Preprocessing: Data cleaning and wrangling techniques were applied to handle missing values, format inconsistencies, and prepare the data for analysis. Exploratory Data Analysis (EDA): Various statistical and visual methods were employed to explore the dataset and uncover patterns, trends, and relationships. Data Analysis: Quantitative analysis techniques were used to derive insights into key metrics such as top games, genre distribution, publisher sales, and user scores.

Dimensions of the dataset: 16719 rows x 16 columns, representing the number of observations (video games) and studied variables about the games, respectively.

Results:

Top five games by critic score:

Grand Theft Auto IV - 98.0; Grand Theft Auto IV - 98.0; Tony Hawk's Pro Skater 2 - 98.0; SoulCalibur - 98.0; Grand Theft Auto V - 97.0

Genre distribution:

Action: 3370; Sports: 2348; Misc: 1750; Role-Playing: 1500; Shooter: 1323; Adventure: 1303; Racing: 1249; Platform: 888; Simulation: 874; Fighting: 849; Strategy: 683; Puzzle: 580;

Publisher sales:

Nintendo: 1788.81; Electronic Arts: 1116.96; Activision: 731.16; Sony Computer

Entertainment: 606.48; Ubisoft: 471.61

User score data wrangling:

Median user score: 7.5 NaN entries replaced

Discussion of Results:

Top Games: The analysis reveals that Grand Theft Auto IV, Tony Hawk's Pro Skater 2, and SoulCalibur are among the top-rated games by critics, suggesting a strong market demand

for immersive gaming experiences. This indicates potential opportunities for game developers and publishers to focus on creating high-quality titles that resonate with players.

Genre Distribution: Action games dominate the market, followed by sports and miscellaneous genres. This highlights the diverse preferences of gamers and underscores the importance of catering to various interests to maximize market reach and revenue potential. Developers may benefit from targeting specific genres based on consumer demand and emerging trends.

Publisher Sales: Nintendo emerges as the top publisher with the highest total global sales, emphasizing the significance of brand reputation and quality content in driving sales. Other leading publishers such as Electronic Arts and Activision also play a significant role in shaping the gaming landscape, indicating fierce competition within the industry.

User Score Data: The median user score of 7.5 reflects a generally positive reception among gamers, although challenges such as missing data entries necessitate robust data cleaning and preprocessing techniques. Addressing these issues is essential to ensure the accuracy and reliability of user score data, enabling stakeholders to make informed decisions based on consumer feedback.

Conclusions: The analysis of the Video Game Sales with Ratings dataset provides valuable insights into the video game industry, offering stakeholders a deeper understanding of market dynamics and consumer behavior. By leveraging these insights, stakeholders can make informed decisions to enhance product development, marketing strategies, and overall business performance.

Recommendations:

Data Quality Assurance: Implement robust data cleaning and validation processes to ensure data accuracy and consistency. Market Segmentation: Utilize genre preferences and user demographics to tailor marketing campaigns and product offerings. Investment Strategies: Consider partnering with top publishers or investing in genres with high market demand and potential for growth. Way Forward: Further research could focus on longitudinal analysis to track trends over time, sentiment analysis of user reviews to gauge consumer sentiment, and predictive modeling to forecast future sales trends and game popularity.