1. Background and Problem Definition

Video Game Sales Analysis (1976-2024)

Background

The video game industry has evolved significantly since its inception, becoming one of the largest entertainment sectors globally. This analysis explores historical video game sales data to understand market trends, consumer preferences, and industry dynamics.

Problem Definition

This project aims to answer the following questions:

- What are the most successful gaming platforms in terms of sales?
- What is the relationship between critic scores and commercial success?
- Which publishers dominate the market?
- How do regional sales patterns differ across markets?

About the Dataset Used

Source: Kaggle . Contains a list of all video games and their sales in various markets around the world

2. Data Wrangling and Cleaning

Load and examine the data

In [103…
```
# Required imports for the analysis
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import plotly.express as px
from datetime import datetime
import warnings
warnings.filterwarnings('ignore')
```

In [104…
```
df = pd.read_csv('vgchartz-2024.csv')
```

Basic data exploration

In [105…
```
def explore_data(df):
    print("Dataset Shape:", df.shape)
    print("\nMissing Values:\n", df.isnull().sum())
    print("\nData Types:\n", df.dtypes)

explore_data(df)
```

```
Dataset Shape: (64016, 14)

Missing Values:
 img                 0
title                0
console              0
genre                0
publisher            0
developer           17
critic_score     57338
total_sales      45094
na_sales         51379
jp_sales         57290
pal_sales        51192
other_sales      48888
release_date      7051
last_update      46137
dtype: int64

Data Types:
 img               object
title             object
console           object
genre             object
publisher         object
developer         object
critic_score     float64
total_sales      float64
na_sales         float64
jp_sales         float64
pal_sales        float64
other_sales      float64
release_date      object
last_update       object
dtype: object
```

Cleaning Data

In [106…
```
def clean_data(df):
    # Convert release_date to datetime
    df['release_date'] = pd.to_datetime(df['release_date'])

    # Fill missing critic scores with median
    df['critic_score'].fillna(df['critic_score'].median(), inplace=True)

    return df
```

```
df = clean_data(df)
```

3. Exploratory Data Analysis

In [107…

```
# Summary of sales by genre
genre_sales = df.groupby('genre')[['total_sales']].sum().sort_values('total_sales',

# Summary of sales by platform
platform_sales = df.groupby('console')[['total_sales']].sum().sort_values('total_sa

# Sales trends over time
if 'release_date' in df.columns:
    df['release_year'] = df['release_date'].dt.year
    sales_by_year = df.groupby('release_year')[['total_sales']].sum()

# Correlation analysis
numeric_columns = ['na_sales', 'jp_sales', 'pal_sales', 'other_sales', 'critic_scor
correlation_matrix = df[numeric_columns].corr()
print("\nCorrelation Matrix:")
print(correlation_matrix)
```

```
Correlation Matrix:
              na_sales  jp_sales  pal_sales  other_sales  critic_score
na_sales      1.000000  0.065091   0.684517     0.687512      0.187096
jp_sales      0.065091  1.000000   0.131796     0.082653      0.064780
pal_sales     0.684517  0.131796   1.000000     0.817030      0.162366
other_sales   0.687512  0.082653   0.817030     1.000000      0.147534
critic_score  0.187096  0.064780   0.162366     0.147534      1.000000
```

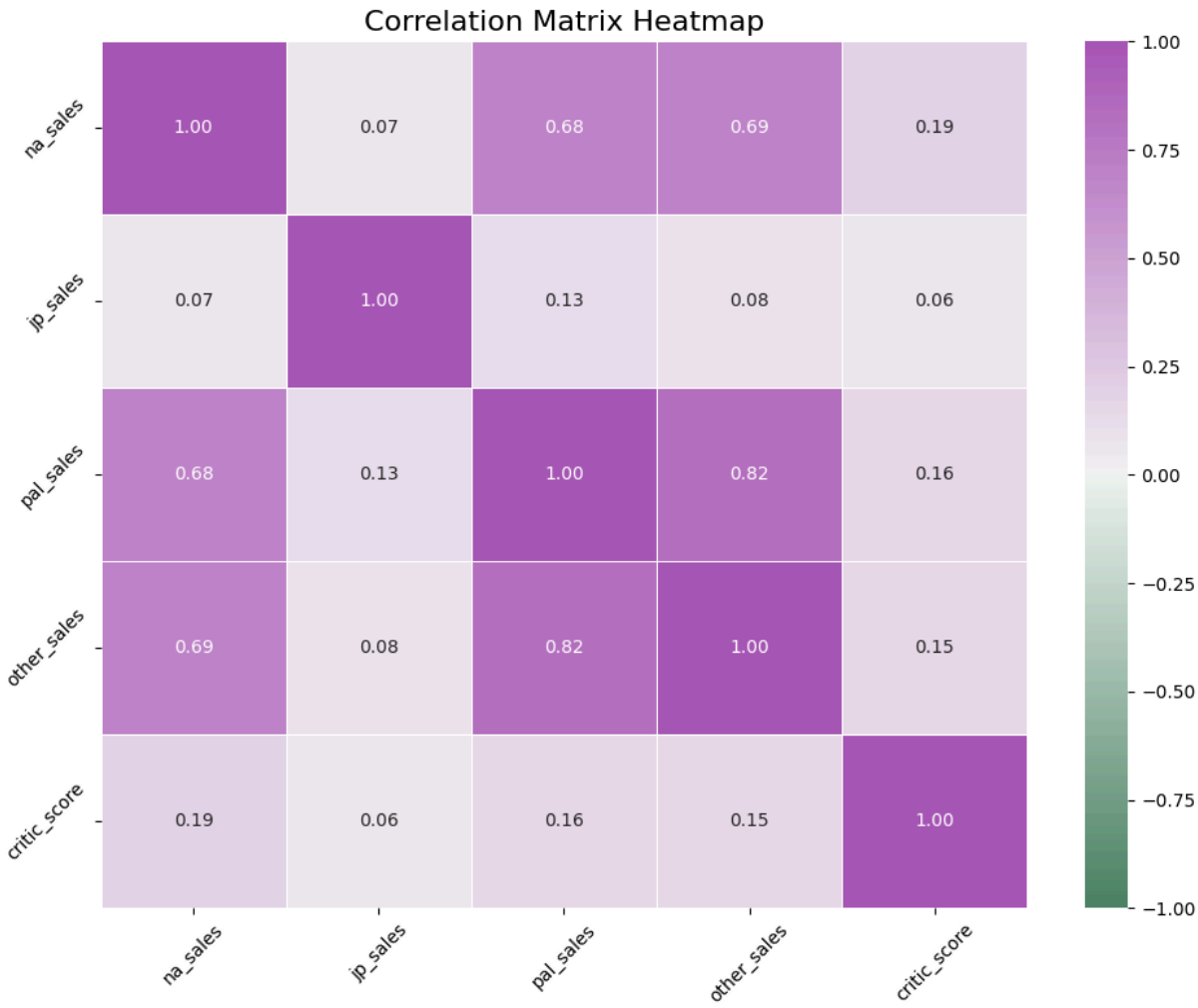
4. Data Visualization

To better visualize the correlation matrix data, we will plot its heat map.

Correlation Matrix

In [108…

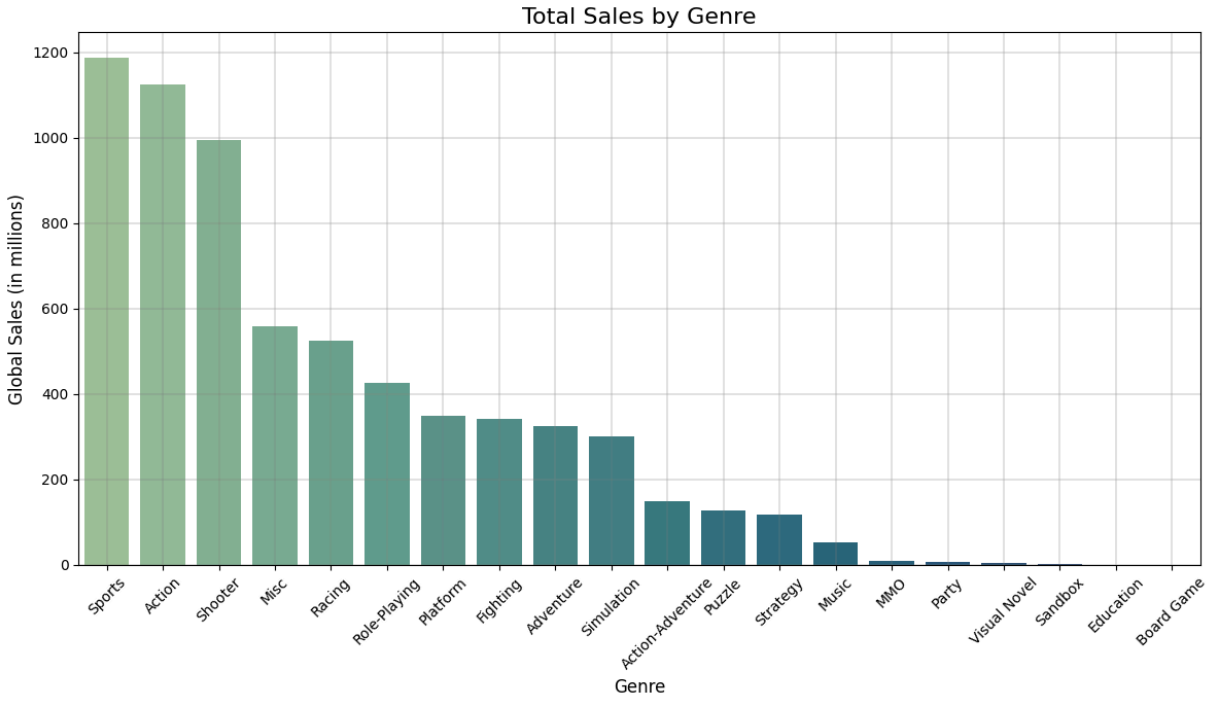
```
plt.figure(figsize=(10, 8))
custom_cmap = sns.diverging_palette(230, 20, as_cmap=True)
sns.heatmap(correlation_matrix, annot=True, fmt=".2f", cmap=sns.diverging_palette(1
plt.title('Correlation Matrix Heatmap', fontsize=16)
plt.xticks(rotation=45)
plt.yticks(rotation=45)
plt.tight_layout()
plt.show()
```



Genre Sales Visualization

In [109…

```
# Genre sales visualization
plt.figure(figsize=(12, 7))
sns.barplot(x=genre_sales.index, y=genre_sales['total_sales'], palette='crest')
plt.title('Total Sales by Genre', fontsize=16)
plt.ylabel('Global Sales (in millions)', fontsize=12)
plt.xlabel('Genre', fontsize=12)
plt.xticks(rotation=45)
plt.tight_layout()
plt.grid(True, linewidth=0.3, color='gray')
plt.show()
```



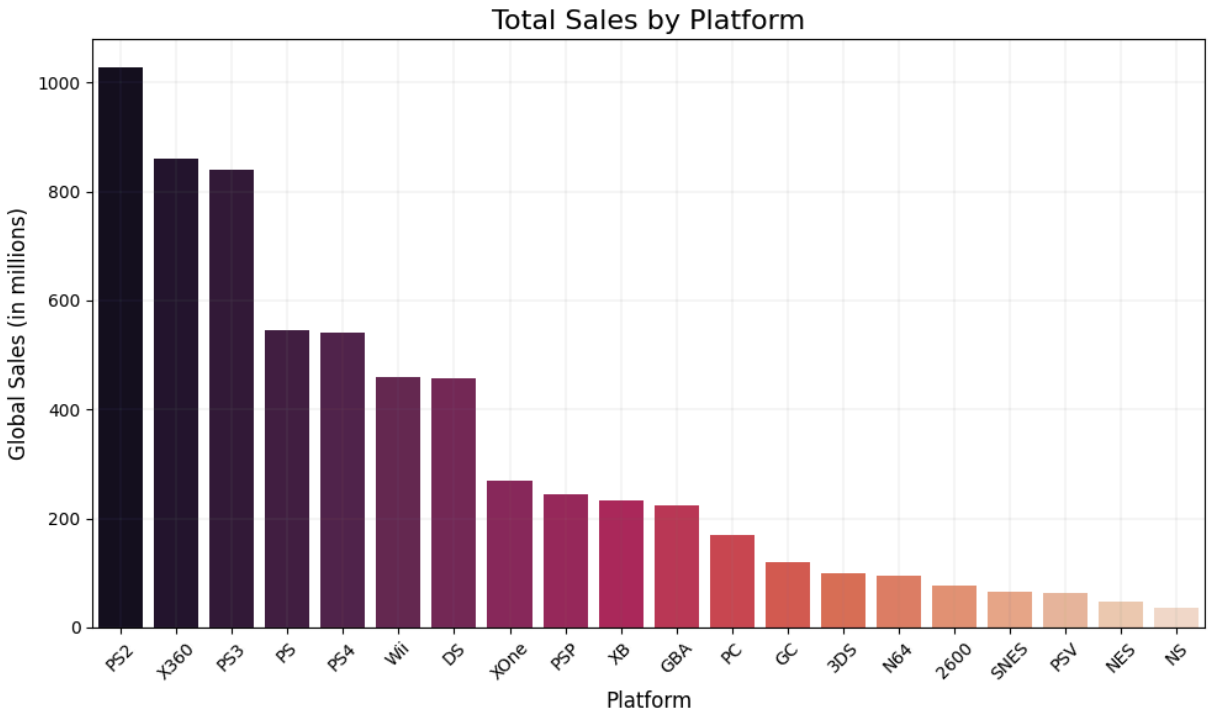
Some key Observations

- The two most sold genres in video games with over a 1000 million sales are Sports and Action.
- As we would expect shooters are also extremely popular coming in at the 3rd most sold genre.

Platform sales visualization

In [127…

```
# since there are too many platforms, we will only show the top 10
top_10_platforms = platform_sales.head(20)

plt.figure(figsize=(10, 6))
sns.barplot(x=top_10_platforms.index, y=top_10_platforms['total_sales'], palette='r
plt.title('Total Sales by Platform', fontsize=16)
plt.ylabel('Global Sales (in millions)', fontsize=12)
plt.xlabel('Platform', fontsize=12)
plt.xticks(rotation=45)
plt.tight_layout()
plt.grid(True, linewidth=0.1, color='gray')
plt.show()
```



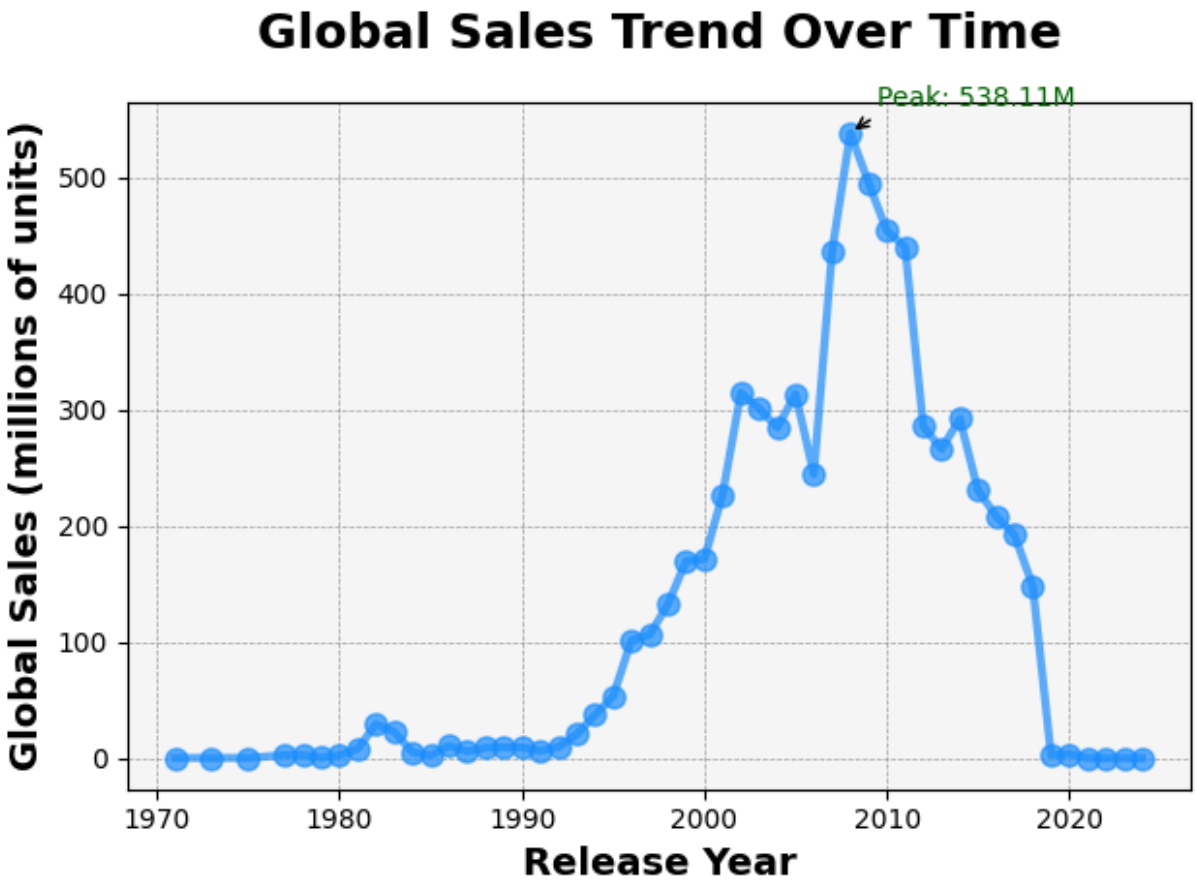
Observations

- Notably, only the PS2 Console had sales above a 1000 million, which is not an easy feat. It goes to show just how popular the PS2 really was.
- The top 5 is mostly dominated by Sony's Playstation, with 4 out of the top 5 spots belonging to it.
- The most popular Xbox seems to be the X360, with sales of around 830 million

Sales by Release Year

In [ ]:
```
plt.plot(
    sales_by_year.index,
    sales_by_year["total_sales"],
    marker="o",  # Circular markers
    linestyle="-",  # Solid line
    linewidth=3,  # Thicker line
    markersize=8,  # Larger markers
    color="#1E90FF",  # Dodger Blue - more vibrant than default blue
    alpha=0.7,
)

plt.title("Global Sales Trend Over Time", fontsize=18, fontweight="bold", pad=20)
plt.ylabel("Global Sales (millions of units)", fontsize=14, fontweight="semibold")
plt.xlabel("Release Year", fontsize=14, fontweight="semibold")

plt.grid(True, linestyle="--", linewidth=0.5, color="grey", alpha=0.7)

# Add a subtle background color
plt.gca().set_facecolor("#F5F5F5")
```

```
# Annotate the highest and lowest points
max_sales_year = sales_by_year["total_sales"].idxmax()
max_sales_value = sales_by_year.loc[max_sales_year, "total_sales"]
min_sales_year = sales_by_year["total_sales"].idxmin()
min_sales_value = sales_by_year.loc[min_sales_year, "total_sales"]

plt.annotate(
    f"Peak: {max_sales_value:.2f}M",
    xy=(max_sales_year, max_sales_value),
    xytext=(10, 10),
    textcoords="offset points",
    fontsize=10,
    color="darkgreen",
    arrowprops=dict(arrowstyle="->", connectionstyle="arc3,rad=0.2"),
)


# Adjust layout and display
plt.tight_layout()
plt.show()
```



Observation

- This shows us how video game sales peaked in 2008 with total sales volume of 538.11 Million.
- This graph also shows us the limitation in our dataset, as after 2010 we see a falloff in sales which should not be the case as video games have grown consistently since 2015.

This indicates a clear lack of data for recent years.

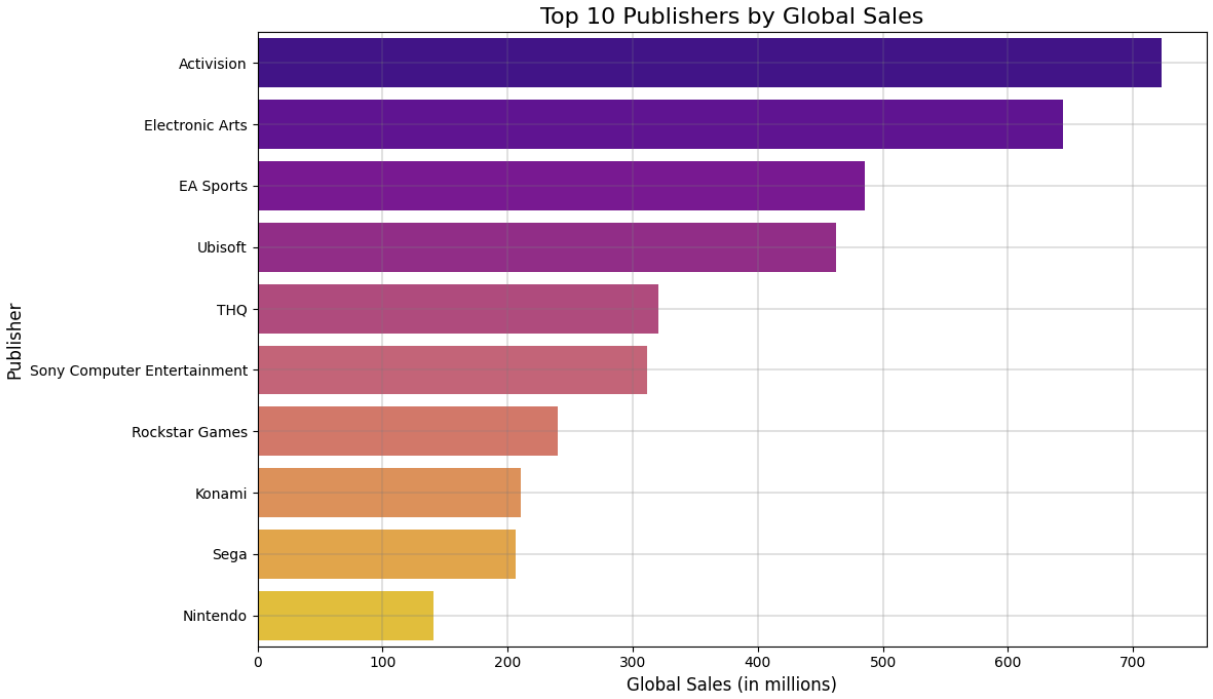
Which Publishers Dominate the Market ?

- To identify dominant publishers, we'll calculate total global sales for each publisher and rank them.

In [112…
```
publisher_sales = df.groupby('publisher')['total_sales'].sum().sort_values(ascendin
```

Visualization for the Top Publishers

In [113…
```
plt.figure(figsize=(12, 7))
sns.barplot(x=publisher_sales.values, y=publisher_sales.index, palette='plasma')
plt.title('Top 10 Publishers by Global Sales', fontsize=16)
plt.xlabel('Global Sales (in millions)', fontsize=12)
plt.ylabel('Publisher', fontsize=12)
plt.tight_layout()
plt.grid(True, linewidth=0.3, color='gray')
plt.show()
```

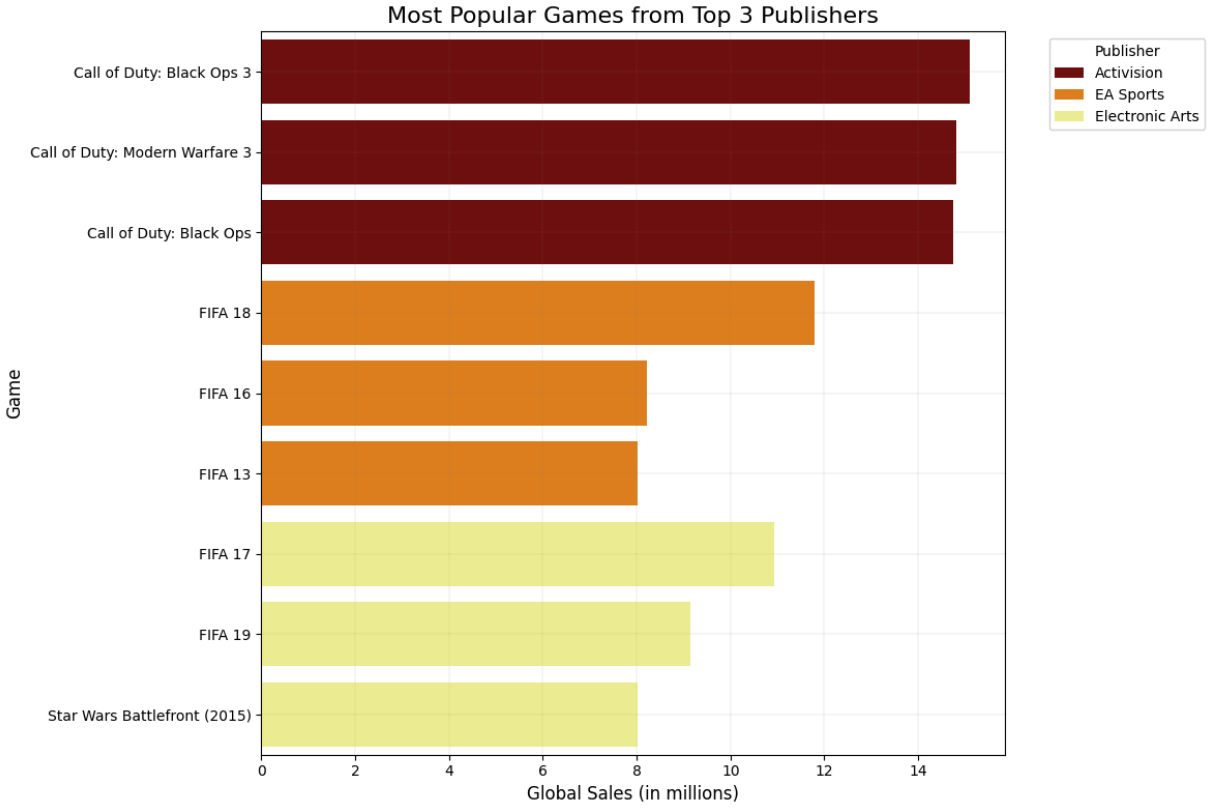


Let's Look at which games from the top 3 publishers are the most popular

In [126…
```
top_3_publishers = publisher_sales.head(3).index

top_publishers_games = df[df['publisher'].isin(top_3_publishers)]

popular_games_by_publisher = (
    top_publishers_games.groupby('publisher')
    .apply(lambda x: x.nlargest(3, 'total_sales'))
```

```
    .reset_index(drop=True)
)

print(popular_games_by_publisher[['publisher', 'title', 'total_sales']])

plt.figure(figsize=(12, 8))
sns.barplot(
    data=popular_games_by_publisher,
    x='total_sales',
    y='title',
    hue='publisher',
    dodge=False,
    palette='afmhot'
)
plt.title('Most Popular Games from Top 3 Publishers', fontsize=16)
plt.xlabel('Global Sales (in millions)', fontsize=12)
plt.ylabel('Game', fontsize=12)
plt.legend(title='Publisher', bbox_to_anchor=(1.05, 1), loc='upper left')
plt.tight_layout()
plt.grid(True, linewidth=0.1, color='gray')
plt.show()
```

	publisher	title	total_sales
0	Activision	Call of Duty: Black Ops 3	15.09
1	Activision	Call of Duty: Modern Warfare 3	14.82
2	Activision	Call of Duty: Black Ops	14.74
3	EA Sports	FIFA 18	11.80
4	EA Sports	FIFA 16	8.22
5	EA Sports	FIFA 13	8.01
6	Electronic Arts	FIFA 17	10.94
7	Electronic Arts	FIFA 19	9.15
8	Electronic Arts	Star Wars Battlefront (2015)	8.03

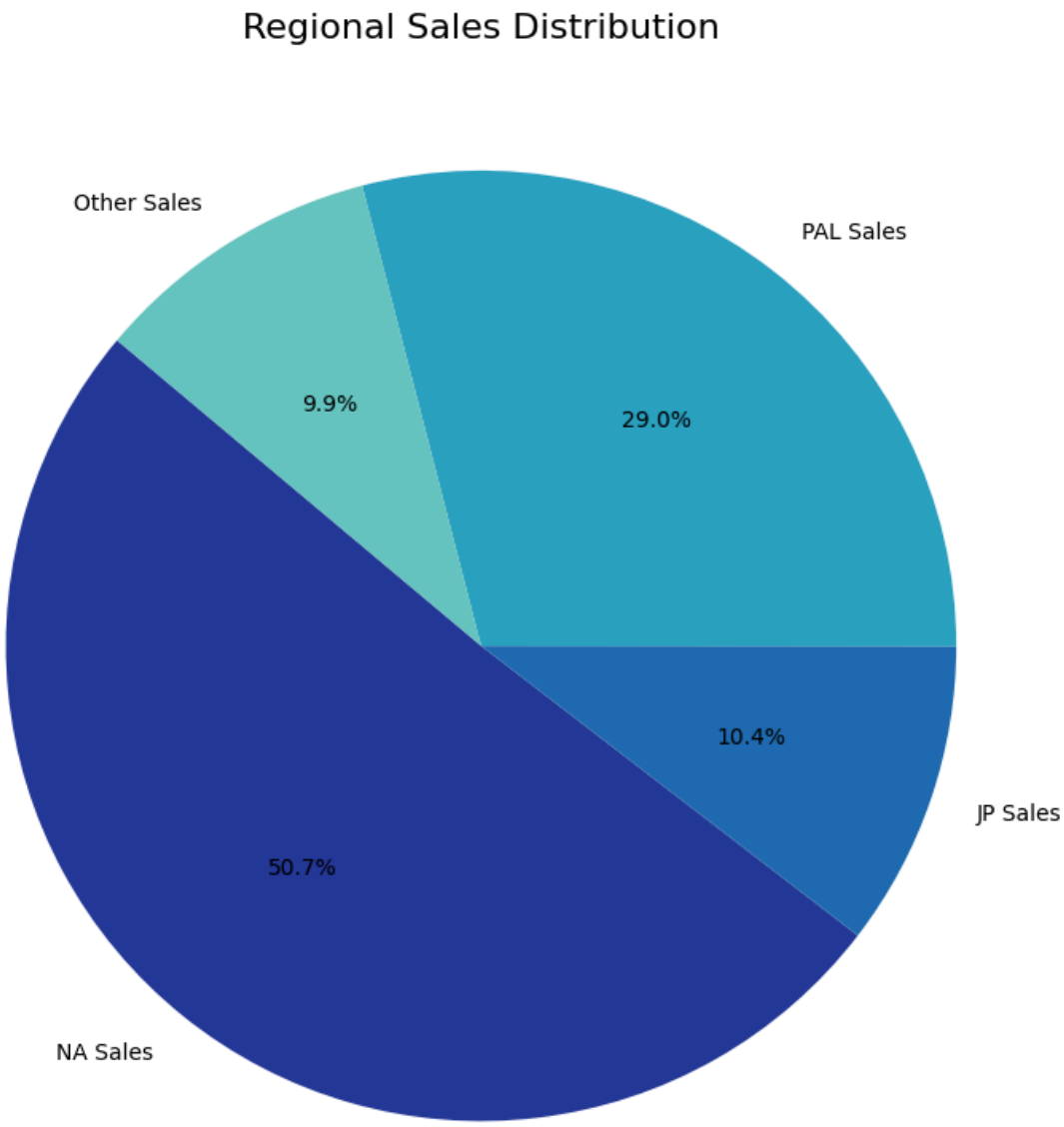


- An interesting Observation here is that EA Sports and Electronic Arts are considered different publishers but both still make it to the top 3. This just goes to show how popular sports games really are, as we saw in the genre analysis.

Regional Sales Pattern

In [130…

```
regional_sales = {
    'NA Sales': df['na_sales'].sum(),
    'JP Sales': df['jp_sales'].sum(),
    'PAL Sales': df['pal_sales'].sum(),
    'Other Sales': df['other_sales'].sum()
}

# Pie chart for regional sales distribution
plt.figure(figsize=(8, 8))
plt.pie(regional_sales.values(), labels=regional_sales.keys(), autopct='%1.1f%%', s
plt.title('Regional Sales Distribution', fontsize=16)
plt.tight_layout()
plt.show()
```



Observations

The distribution of sales across regions indicates a strong dominance of the North American (NA) market, which accounts for 50.7% of total sales. The Europe/Africa(PAL) region follows with a significant share of 29.0%, while the Japanese (JP) market contributes 10.4%. Sales in other regions collectively make up the remaining 9.9%.

This highlights the importance of the North American and Europe/Africa markets in driving global video game sales, while Japan and other regions, though smaller contributors, still represent key segments with notable consumer bases.

Key Findings

Based on the exploratory data analysis and visualizations, we can draw the following key observations:

1. Platform Performance:

- The most successful gaming platforms in terms of sales appear to be PS2, X360, and PS3.
- The playstations dominate console sales

2. Genre Trends:

- Action, Sports, and Shooter genres are the most popular genre of video games.
- Some of these games incluse franchises like Fifa, Call of Duty and other

3. Critic Scores and Commercial Success:

- There's a positive correlation between critic scores and sales, particularly for NA and PAL markets.
- However, the correlation is not very strong, suggesting that high critic scores don't always guarantee high sales.

4. Publisher Dominance:

- A few major publishers like Electronic Arts, Activision, and Ubisoft dominate the market in terms of total sales.
- There's a long tail of smaller publishers with fewer high-selling titles.

5. Regional Sales Patterns:

- North America and Europe/Africa (PAL regions) dominate the video games market.

Conclusion

The analysis reveals significant trends in the video game industry. PlayStation consoles, such as the PS2 and PS3, lead in platform sales, solidifying their dominance in the market. Popular genres like action, sports, and shooter games, including franchises such as FIFA and Call of Duty, consistently attract players. While critic scores show a positive correlation with sales, particularly in North America and PAL regions, the correlation is moderate, indicating that high scores alone do not guarantee commercial success. The industry is largely dominated

by major publishers like Electronic Arts, Activision, and Ubisoft, though smaller publishers contribute to the market's diversity. Regional sales patterns underscore the importance of North America and Europe/Africa as the primary drivers of video game sales worldwide.

Citation

Brannen, B., & Asaniczka. (2024, January 29). Video game sales 2024. Kaggle. https://www.kaggle.com/datasets/asaniczka/video-game-sales-2024