



GROUP 6 CAPSTONE PROJECT:

TRENDS IN VIDEO GAME SALES AND A PREDICTIVE ANALYSIS OF THE INDUSTRY

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THE TEAM



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BACKGROUND

- Wanted to examine historical sales of video games
 - Try to make predictive analysis on how much a game would sell given our data
- Main factors included critic score, genre, developer, and more
- Technical Goals: Simulate data stream from the cloud
- Analysis Goals: Find what factors affect video game sales

EXPLORATORY QUESTIONS

1. How does a game's rating impact its sales?
2. Do certain genres sell more than others?
3. How are global sales trending over time?
4. What factors have the most influence on game sales?
5. Do different consoles sell more games than others?
6. How much does a game's content rating impact sales?



TECHNOLOGIES USED



Kafka

PowerBI

Azure Data Lakes

Azure Databricks

Azure Data Factories

Python

SQL

Machine Learning



Power BI

SQL



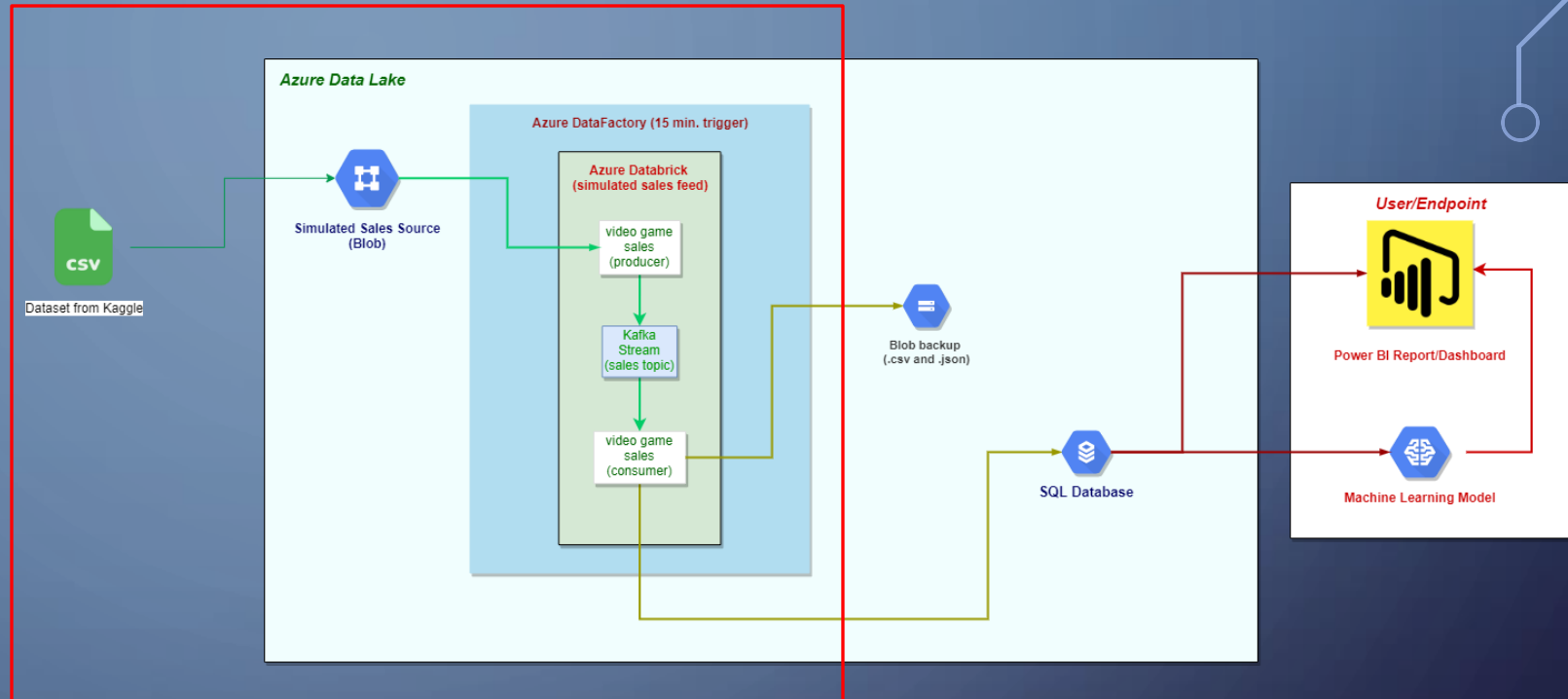
kafka

OUR DATA

- Sources we retrieved data from include:
 - Kaggle
 - VGChartz
 - US Census Bureau

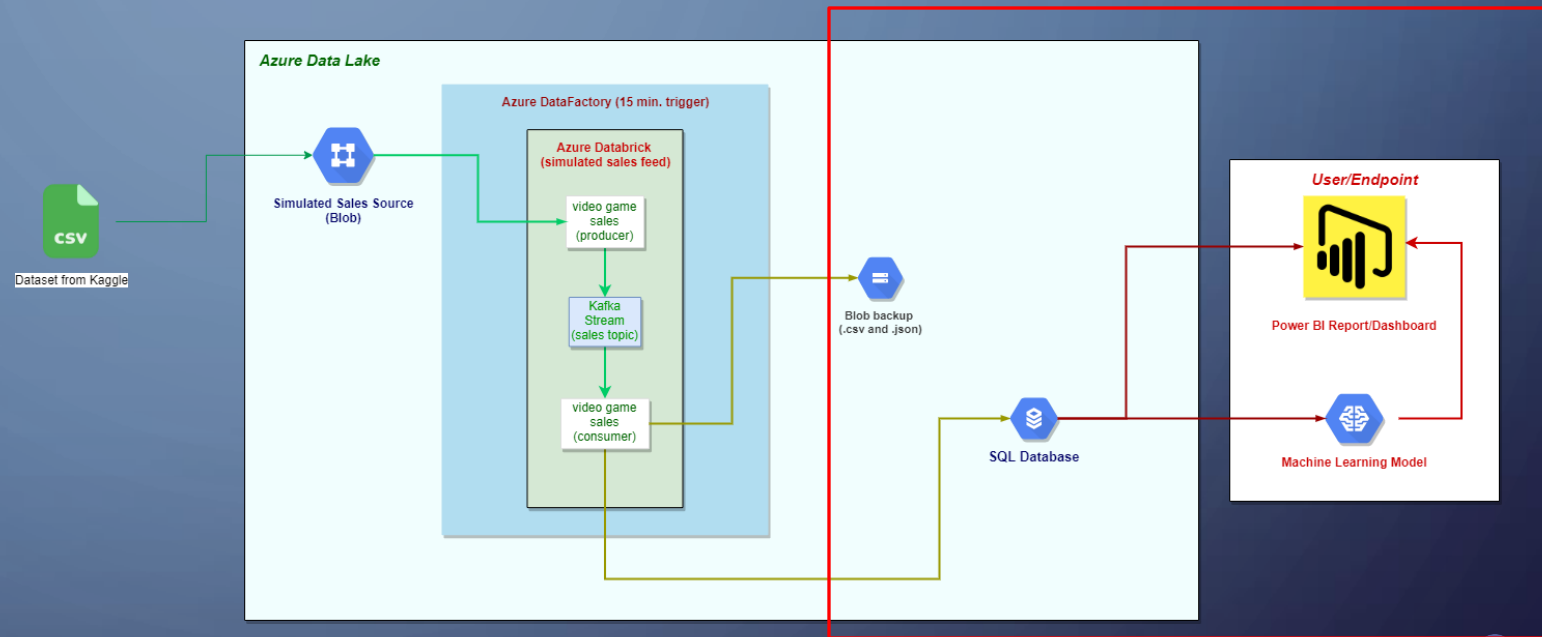
OUR DATA PLATFORM

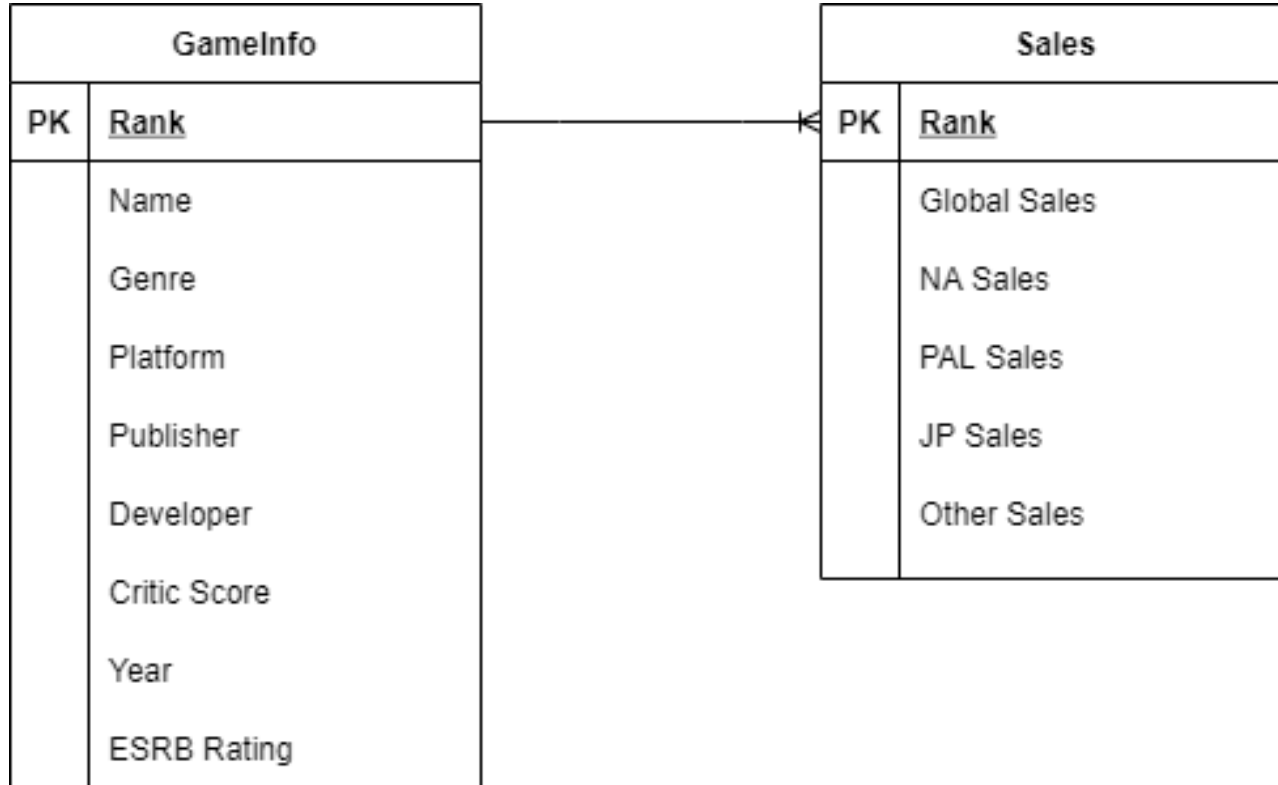
- Our goal is to simulate a DataStream
- Started with manually uploading a csv to the cloud
- In Azure Databricks:
 - Grabbed data from csv in the blob
 - Set up a producer to send messages to the cloud
 - Then set up a consumer to get data
 - Store the consumed data in a blob for backup



DATA PLATFORM (CONTINUED)

- After data is consumed, send to SQL database
- Once in the SQL Server:
 - The ML model pulls data from the server and sends results to Dashboard
 - The Dashboard pulls data from the server

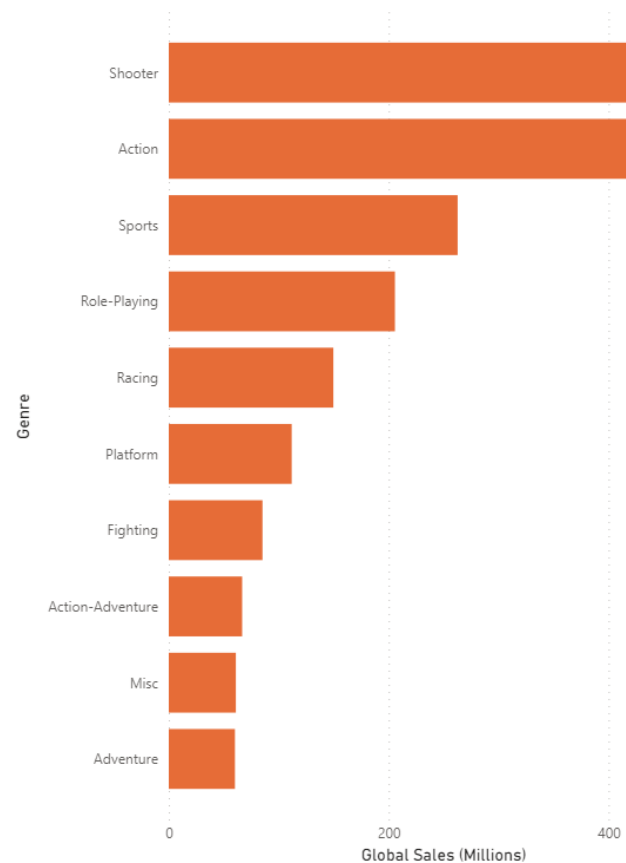




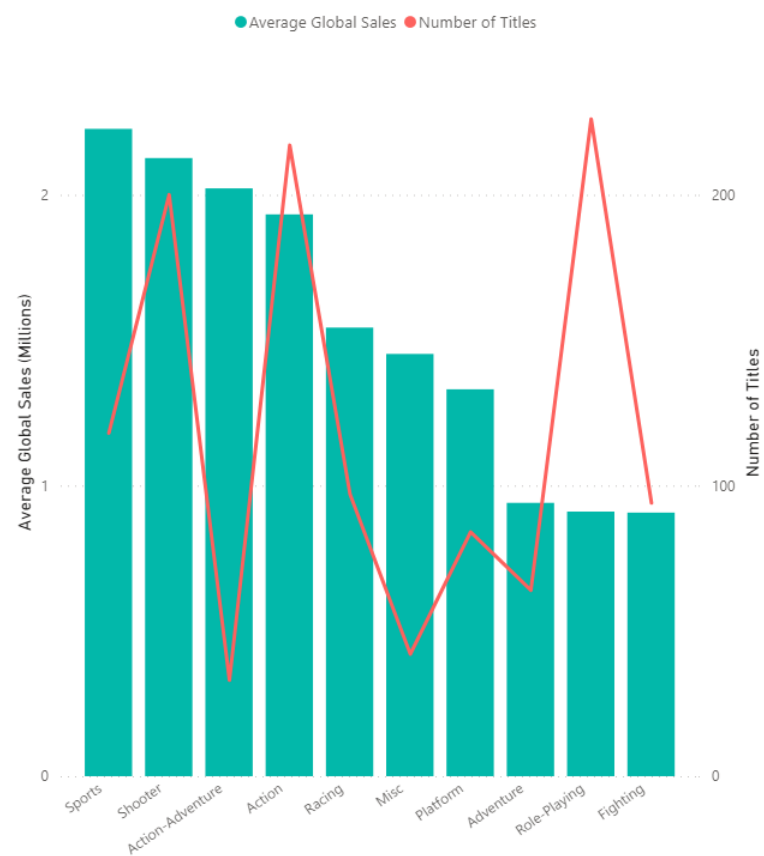
SQL DATABASE

- Temporary table created in SQL database
- DDL Schema used to create tables as shown to the right
- DML Script used to pull data from temporary table into tables created using DDL Schema

Top 10 Genres based on Overall Global Sales



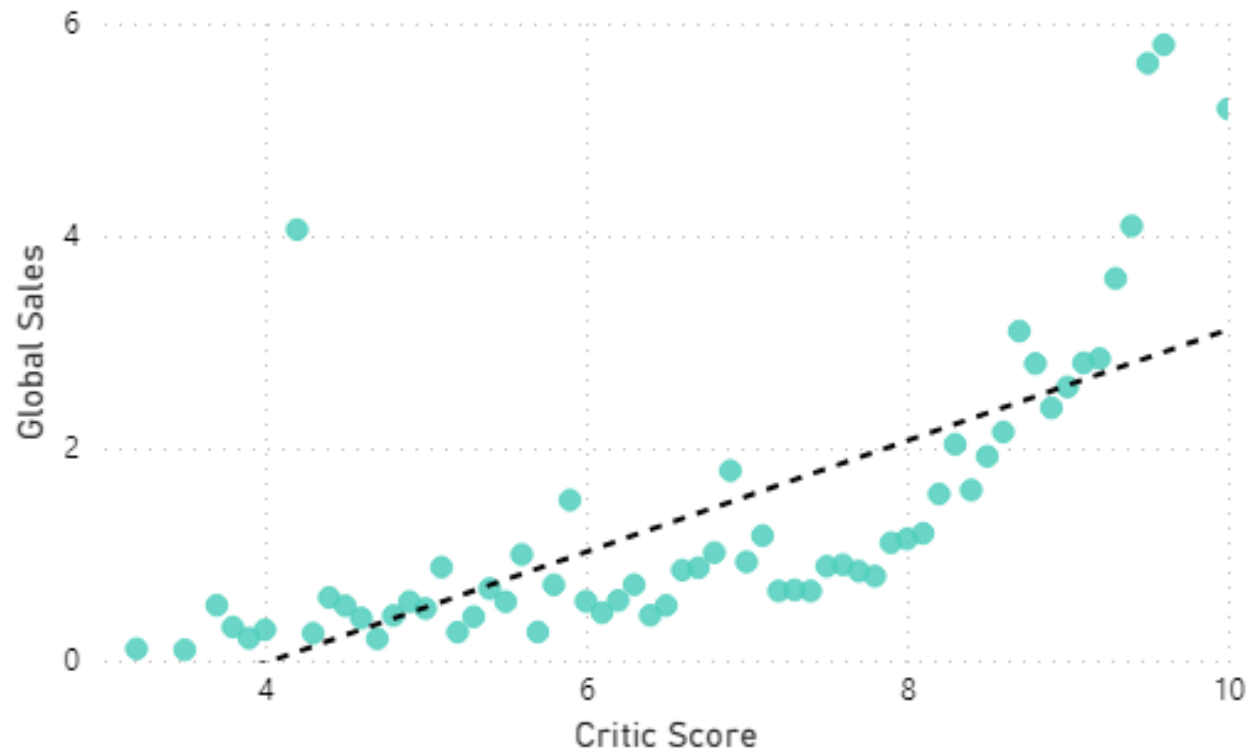
Average Global Sales by Genre (Top 10)



RESULTS

- Top Genres based on overall global sales are Shooter, Action and Sports
- Top Genres based on average global sales are Sports, Shooter and Action-Adventure

Critic Score vs Global Sales



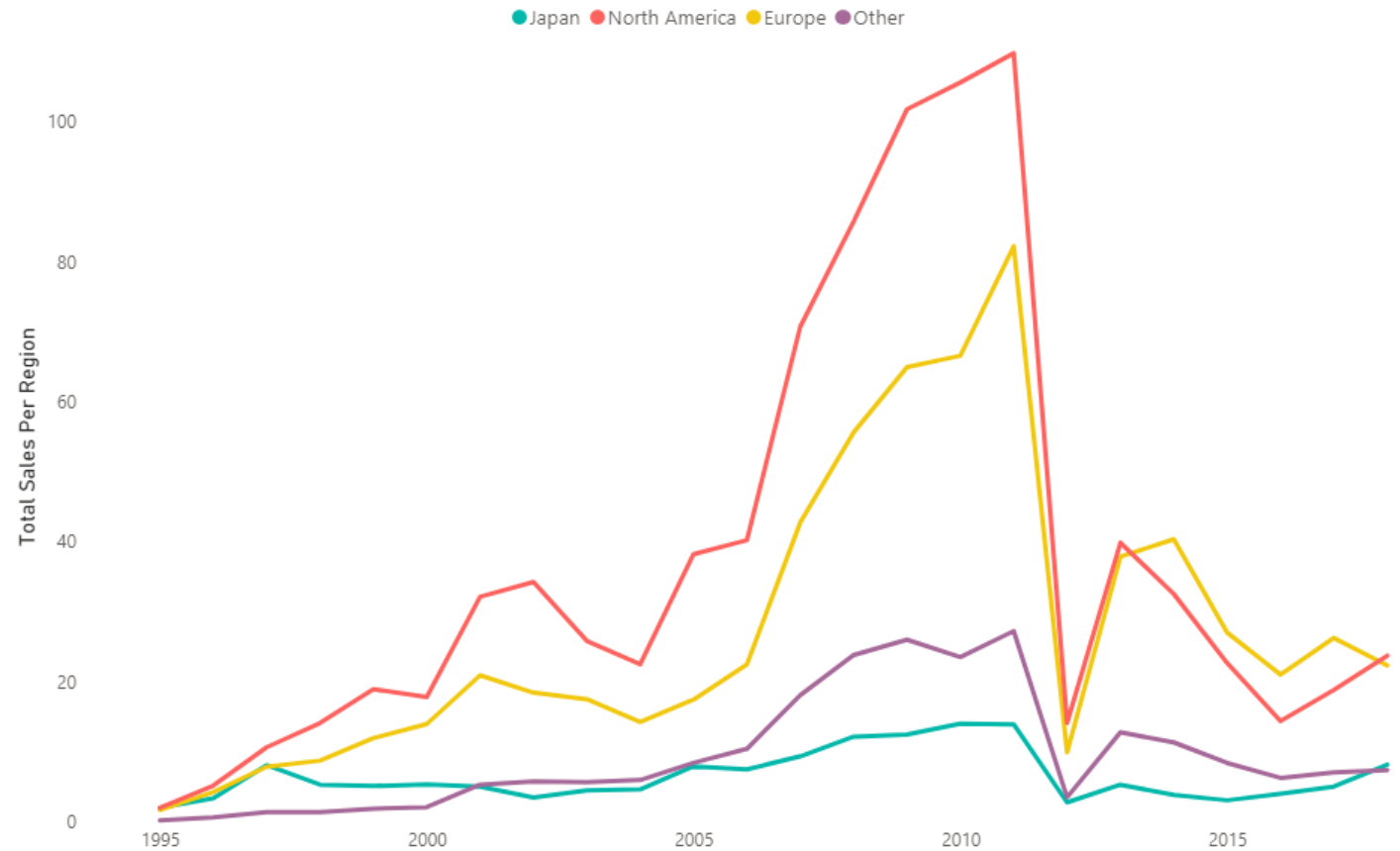
RESULTS

- Scatterplot shows Global Sales vs Critic Score
- As critic score increases so does the sales of a game
- The trendline is upward sloping indicating a positive correlation

RESULTS

- Line graph shows sales over time for different regions
- North America is almost always the top selling region
- Japan sales tend to always be the lowest
- Sharp drop theorized to be because of changes

Game Sales By Region



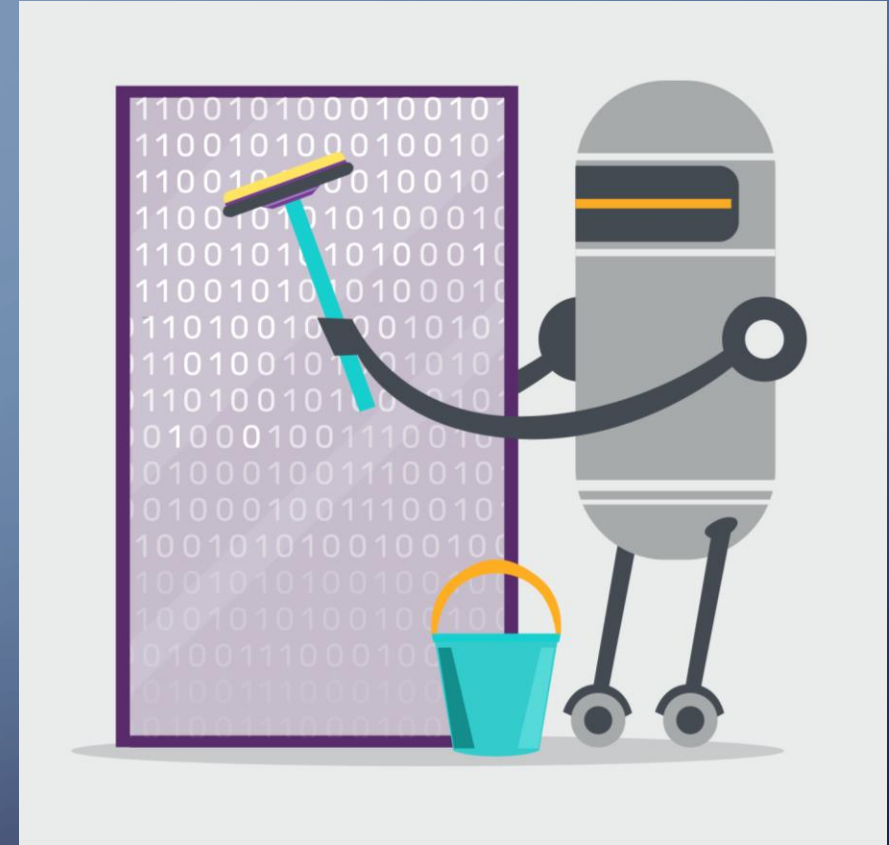
DATA PREPARATION:

Removed Nulls

Grouped Developers and Publishers by prominence in dataset.

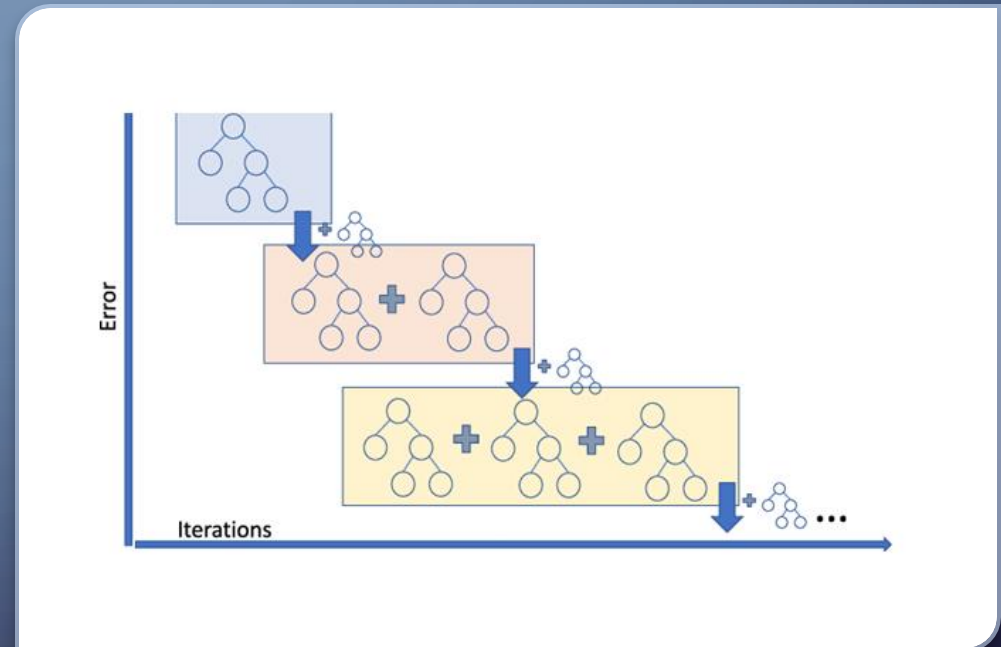
Curious about the influence of a title's name length on its sales.

Applied log-normal transformation to global sales before feeding it into our model

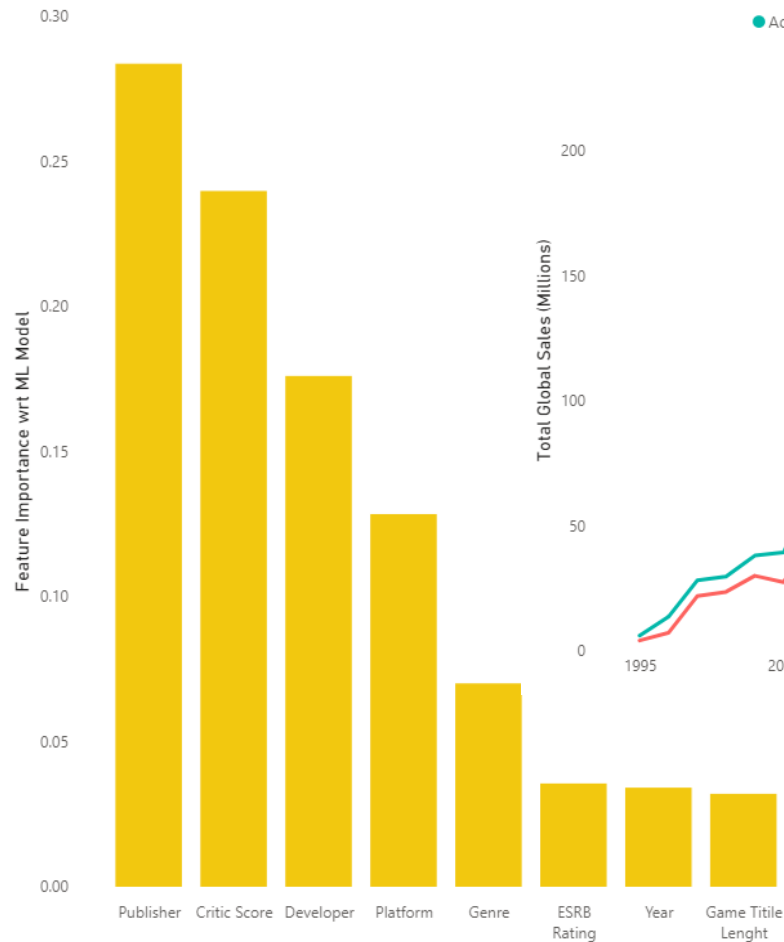


ON THE ML MODEL: GRADIENT BOOSTING REGRESSION

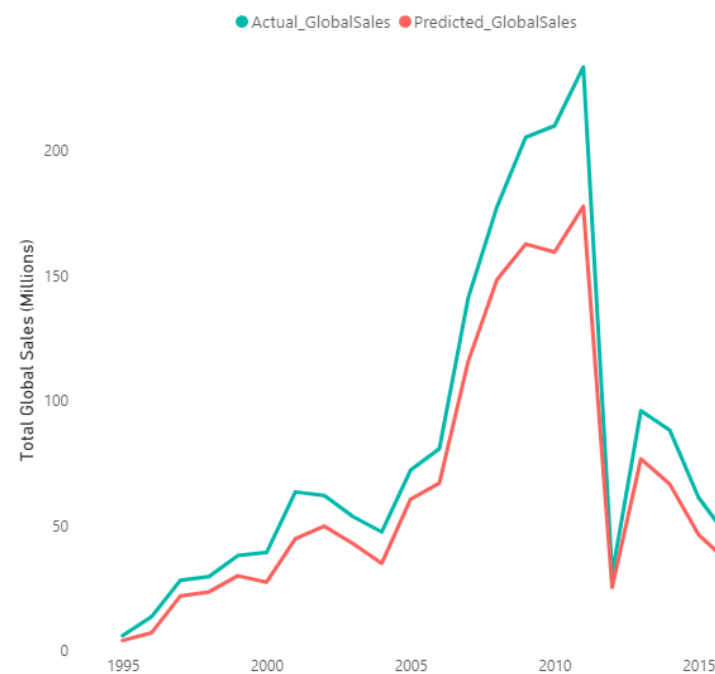
- It is an ensemble technique which uses multiple weak learners to produce a stronger model
- It requires:
 - A loss function to optimize
 - A weak learner to make predictions
 - An additive model to add weak learners to minimize the loss function



Hierarchy of Fit Parameters w.r.t ML Model



GradientBoosting Regressor ML Model: Actual vs. Predicted Global Sales



MACHINE LEARNING OUTCOMES:

The GradientBoostRegressor() from sklearn's ensemble directory was used. It was optimized using a grid-search to give the following parameters:

- Learning rate: 0.001
- Max depth: 5
- Max features: sqrt
- N estimators: 15,000

After Tuning our model is approx. 60% accurate in its predictive ability

The background is a dark blue gradient with a faint grid pattern. Overlaid on this are white circuit-like lines with circular nodes, extending from the left and right sides towards the center. A faint, pixelated world map is visible in the background, primarily in the upper right quadrant.

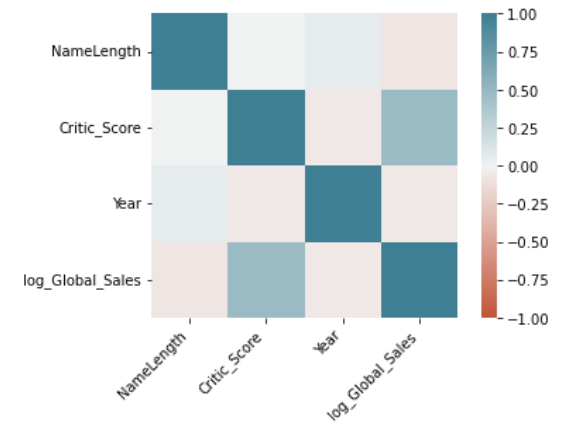
LIVE DASHBOARD DEMO

RECOMMENDATIONS FOR IMPROVEMENT

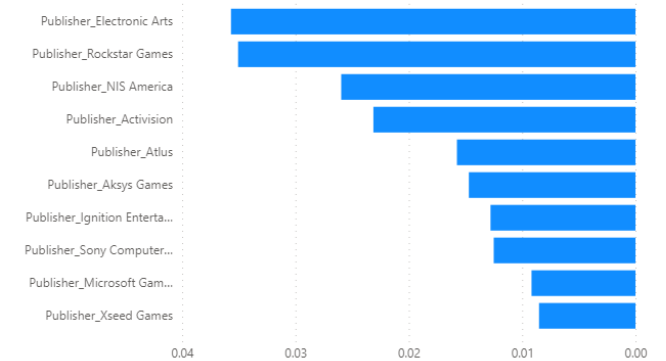
- Finding a cleaner dataset
 - Data had a ton of missing values, was very, very messy
 - Probably the reason we couldn't get above 60% for accuracy
- Ideas:
 - Could try and find digital sales information

SO YOU WANT TO MAKE VIDEO GAME: NOW WHAT?

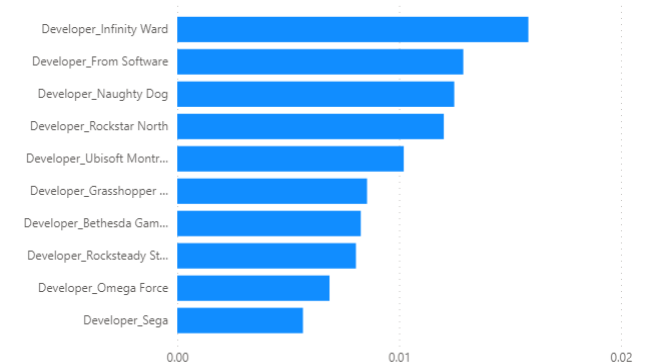
- Publish with a large/well known publisher
 - Publisher had the highest fit score on the model
- Make an action or shooter game
 - Only two genres with more than 400M in sales, next closest had less than 300M
- Good reviews help too
 - Critic score has a positive correlation with sales, as per the correlation matrix



Feature Importance by Publisher (Top 10)



Feature Importance by Developer (Top 10)



Data Sources

References:

- 1.) **Video Games Sales 2019**, “Sales and Scores for more than 55,000 games”. Retrieved from [Kaggle](#)
- 2.) **Video Game Dataset**, “474417 Game with Metacritic Score, Ratings, Genres, Publishers, Platforms, ...”
Retrieved from [Kaggle](#)
- 3.) [VGChartz](#) (For web-scraping)
- 4.) [US Census Bureau](#), Retail Trade: Summary Statistics for the U.S., States, and Selected Geographies: 2017.
Survey/Program: Economic Census, TableID: EC1744BASIC, Dataset: ECNBASIC2017. ([directlink](#))

ANY QUESTIONS?

- Thank you!
- Data sources: