Data Science and Artificial Intelligence in Industrial Work I

TED Talks Viewership Analysis- A CRISP-DM Approach

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About the Business

About Us

Squirrel Studios

A marketing and branding agency focused on data-driven strategies.

About the Client

About the Brand

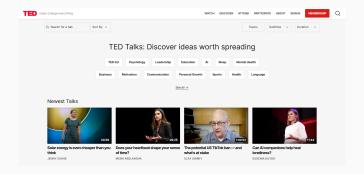
TED: Technology, Entertainment, and Design

- A non-profit organization focusing on Technology, Entertainment, and Design.
- Mission: Spread powerful ideas to spark conversation and drive change.
- Key Metrics:
 - 2B global views
 - 180M monthly followers.

Ted Talks: Discover ideas worth spreading

 Talks on Technology, Entertainment and Design – plus science, business, global issues, the arts and more.

The Brand



Source: https://www.ted.com/talks

Client Query

Client Query

Objective of the Analysis:

 TED wants to investigate whether the phenomenon of shorter attention spans in humans has reduced the viewership of their videos.

Specific Focus Areas:

- The potential impact of short-form media platforms such as:
 - TikTok: Launched in 2016.
 - Instagram Reels: Launched in 2020.

Project Goals

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Business Goal

Help TED improve viewership of TED Talks videos and establish Squirrel Studios as a leader in brand data analytics.

Project Goal

Explore how factors such as duration influence TED Talks viewer engagement.

Project Stages

Project Stages

Project stages involve:

- 1. Centralize the client's goal \rightarrow Data analytics to assess the relationship between duration and viewership.
- 2. Request for resources from the client \rightarrow TED Talks dataset.
- 3. Process and analyze resources \rightarrow Tech stack: Python, Pandas, Numpy, VS Code, Git.
- 4. Gather actionable insights through internal evaluations.
- 5. Submit a report to the client ightarrow Including suggestions made by Squirrel Studios.

About the Data

About the Data

Dataset Overview:

- Contains data on all TED Talks until April 18th, 2020.
- Main file: ted_main.csv.
- Features include views, tags, posted date, speakers, and titles.

Acknowledgements: Data scraped from the official TED website.

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¹https://www.kaggle.com/datasets/ahmadfatani/ted-talks-dataset?resource=download

Data Understanding

Data Understanding (Table 1)

Table 1: Data Categories

Feature	Description		
title	Title of the TED Talk.		
speaker_name	Name of the speaker who delivered the talk.		
views	Total number of views the talk received (en-		
	gagement metric).		
tags	Comma-separated list of tags describing		
	themes or topics of the talk.		
duration	Length of the talk in MM:SS format (convertible to seconds).		
posted_date	Date the talk was published, in MMM YYYY		
,	format.		
about_talk	Brief description of the talk content.		
about_speaker	Information about the speaker, such as their		
·	background or expertise.		

Data Understanding (Table 2)

Table 2: Category Types

Feature Type	Features
Text-Based Features	title, tags, about_talk, about_speaker
Numerical Features	views, duration
Date Feature	posted_date

Top 5 Most Viewed Videos

Table 3: Top 5 Most Viewed Videos

Title	Views
This is what happens when you reply to spam email	60,237,459
Inside the mind of a master procrastinator	40,135,933
The next outbreak? We're not ready	36,342,453
My philosophy for a happy life	35,114,993
What makes a good life? Lessons from the	34,095,862
longe	

Top 5 Least Viewed Videos

Table 4: Top 5 Least Viewed Videos

Title	Views
Cómo usar el arte de la fotografía para restau	10,231
"Illusions for a better society"	10,687
Undocumented lives, inside out	10,793
Humanity at the intersection of science and	11,028
ar	
Por qué necesitamos proteger el alta mar	11,411

Data Preparation

Data Cleaning Steps:

- Cleaning the views Column:
 - Replaced invalid entries such as empty strings, "N/A," or "None" with NaN.
 - Removed commas from numerical entries (e.g., 60,237,459).
 - Converted the column to a numeric format, with invalid entries coerced to NaN.
- Cleaning the duration Column:
 - Created a function to convert MM:SS format into seconds.
 - Invalid formats were handled by assigning NaN.

Data Loss

Metrics Before and After Cleaning:

Table 5: Metrics Before and After Cleaning

Metric	Before Cleaning	After Cleaning
Number of Unique Videos	2160	2155
Number of Unique Speakers	1915	1912

Average Views and Duration

Key Statistics:

- Average Number of Views: 2,060,890.82
- Average Duration: 658.50 seconds (approximately 11 minutes)

Modeling and Evaluation

Modeling and Evaluation - Part 1

Objective: Assess the influence of talk duration on TED Talks viewership using statistical modeling.

Steps Taken:

1. Data Normalization:

 Normalized duration and views to improve model convergence by scaling it

2. Model Building:

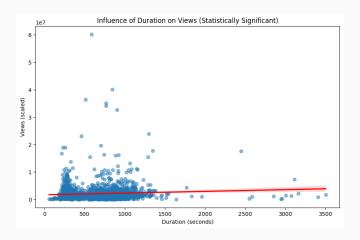
- Used a Mixed Linear Model (LMM) to predict views based on duration_scaled.
- Included speaker_name as a random effect to account for speaker-specific effects.

Modeling and Evaluation - Part 2

Steps Taken (continued):

- 3. Model Evaluation:
 - Examined statistical significance of duration:
 - **p-value:** 0.004 (statistically significant at 0.05 level).

Key Insights:



Key Insights:

- The p-value for duration (0.004) is below the common significance threshold of 0.05.
- This indicates that the relationship between video duration (scaled) and normalized views is statistically significant.
- Duration of a talk positively influences its viewership.

Project Report and Suggestions

Suggestions and Future Work

Recommendations on TED Talk Viewership:

- Content Optimization:
 - Ensure talks are engaging and long, aligning with the duration analysis.

Future Work

Areas for Further Analysis:

- Impact of Translations: Investigate how translated titles and subtitles affect viewership and identify best practices for localization.
- Engagement Metrics: Analyze other engagement metrics, such as likes, shares, and comments, to gain a comprehensive understanding of audience interaction.