

Initial Data Analysis Report: Flickr-30k for AI Bias Baseline

1. Introduction

This project involves gates this critical AI ethics issues. It aims to quantitatively compare the demographic biases present in AI-generated images against a baseline derived from a large, human-annotated dataset (Flickr30k), which serves as a proxy for the type of data the AI was likely trained on. This project provides empirical data relevant to the ongoing research in Responsible AI, offering a methodology to benchmark bias amplification and inform mitigation strategies.

This report covers the initial Exploratory Data Analysis of the Flickr-30k dataset, which will serve as the "real-world baseline." The goal of this EDA is to verify the dataset's structure, content, and feasibility for this purpose.

2. Data Origin and Gathering

- **Source:** The Flickr-30k dataset was obtained from Kaggle (*Flickr Image dataset*). The dataset consists of 31,783 unique images sourced from Flickr, each with 5 human-written captions.
- **Gathering Process:** The dataset archive was downloaded and the cap on file (results.csv) was extracted into the project's data/ directory. The analysis was performed on this CSV file.
- **Connection to Topic:** This dataset serves as a proxy for the diverse, user-generated "web-scale" data used to train models like Stable Diffusion. The captions are the key to filtering this large, unstructured image set to find images relevant to specific professional roles.

3. Data Characteristics

- **Format:** The cap on data is a CSV file using a pipe (|) delimiter. The primary features are image_id (the image filename) and cap on (the text description).
- **Amount of Data:**

```
--- Initial Data Characteristics ---
Total number of captions (entries): 158915
Number of unique images: 31783
Columns: ['image_id', 'comment_number', 'caption']
```

- **Data Structure:**

```
Data Info:
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 158915 entries, 0 to 158914
Data columns (total 3 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   image_id         158915 non-null   object 
 1   comment_number   158915 non-null   object 
 2   caption          158915 non-null   object 
dtypes: object(3)
memory usage: 3.6+ MB
```

4. Data Cleaning and Preprocessing (Stage 1)

- **Process:** The `eda_script.py` performs several key cleaning steps before analysis:
 1. **Loading:** The data is loaded using `pandas.read_csv`.
 2. **Header Row:** The first row of the file, which contained headers (`image_name`, `comment`), was identified and skipped using the `skiprows=1` parameter.
 3. **Missing Values:** The `df.info()` summary identified one single null caption. This was filled with an empty string using `df['caption'].fillna('')` to prevent errors during text processing.
 4. **Text Normalization:** For keyword analysis, captions are passed through a cleaning function-`advanced_clean_caption` which converts all text to lowercase, removes punctuation/numbers, and filters out common English stop words (using the NLTK library) to focus on meaningful words.

5. Initial Data Exploration (Stage 1 Results)

- **Caption Length Analysis:** An analysis was performed on the word count of all 158,915 captions.
 - **Statistics:**

```
--- Caption Length Analysis ---
count    158915.000000
mean     13.389334
std      5.421130
min      0.000000
25%     10.000000
50%     12.000000
75%     16.000000
max     82.000000
Name: caption_length, dtype: float64
```

- **Visualization:** The distribution of caption lengths is right-skewed, with most captions falling between 5 and 20 words. This is ideal, as it suggests captions are descriptive but not overly complex.

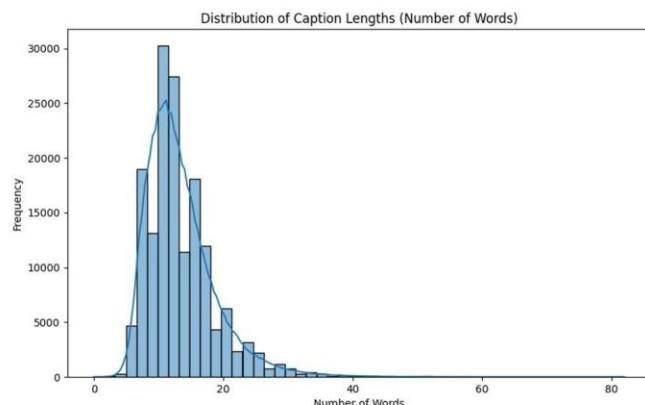


Figure 1: caption_length_distribution.png

6. Targeted Analysis: Keyword Filtering (Stage 2 Results)

- **Methodology:** To assess feasibility for our project, the cleaned captions were searched for a list of 10 keywords representing professional roles. The number of unique images associated with each keyword was calculated.
- **Results:** The following table and chart show the number of unique images found for each role:

| Keyword | Unique Images Found |
|-----------|---------------------|
| artist | 181 |
| driver | 105 |
| chef | 92 |
| teacher | 90 |
| doctor | 44 |
| scientist | 24 |
| nurse | 21 |
| pilot | 20 |
| engineer | 7 |
| builder | 2 |

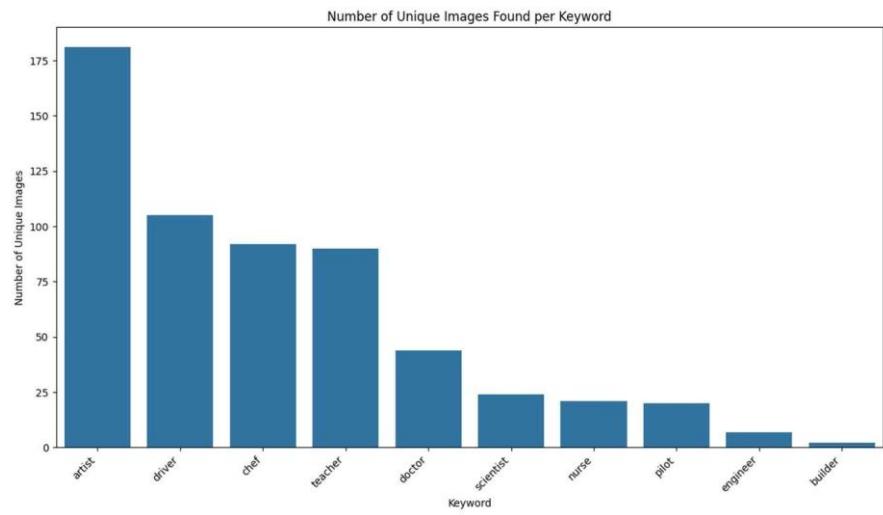


Figure 2 : keyword_image_counts.png

- **Interpretation:**

- The keywords artist, driver, chef, and teacher are well-represented, providing a strong baseline dataset.
- doctor is moderately represented and will be included.
- scientist, nurse, and pilot have low representation (20-24 images). These can be analyzed, but the small sample size will be noted as a significant limitation.
- engineer (7 images) and builder (2 images) are statistically insufficient for this analysis and **may be excluded** from the final project.

7. Conclusion & Next Steps

- **Summary:** This EDA confirms the Flickr-30k dataset is a large, high-quality source of captioned images. The data is largely clean, and the captions are of a useful length.
- **Feasibility Assessment:** The dataset is **conditionally feasible**. It can provide a robust baseline for common roles (artist, teacher, etc.) but is sparse for more technical or specific roles (engineer).
- **Next Steps:** The project will proceed by focusing on the 8 roles with sufficient data. The next phase (Phase 2) will involve running the **deepface** classifier on the identified image lists for these 8 roles to build the final demographic baseline.