

MSc. Data Science & Artificial Intelligence

Introduction to Machine Learning

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Final project: Petfinder, predicting adoption

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1 Problem description

The problem we are trying to solve consists of predicting whether an animal will be adopted from a shelter within 30 days, given several pieces of information on this animal. This problem is a clean and reduced version of a Kaggle competition dating back from 2019.

2 Exploratory Data Analysis

We would like to get some basic information of the data set before diving into the machine learning solution.

The training set has shape (8168×16) and the test set has shape (250×16) , where the column names and data types are summarized in Table 1.

CATEGORICAL		NUMERICAL	TEXT	IMAGE
Type Gender Breed Color1 Color2 Color3	MaturitySize FurLength Vaccinated Dewormed Sterilized Health	Age Fee	Description	Images

Table 1: Data types per column

Overall, the data set is very clean as it contains 0 NaN values.

3 Problem Solution

3.1 Overview

The problem can be solved by using a pipeling, which is represented in Figure 1. The pipeline consists of two steps:

- Data Pre-processing
- Classification

We will detail these two steps in the following subsections.

3.2 Data Preprocessing

We saw in section 2 that the data is already fairly clean (e.g. in terms of NA's). We still need to process the columns, which we do depending on the type of data they contain. As per Figure 1, we use:

- A Categorical Preprocessor
- A Numerical Preprocessor

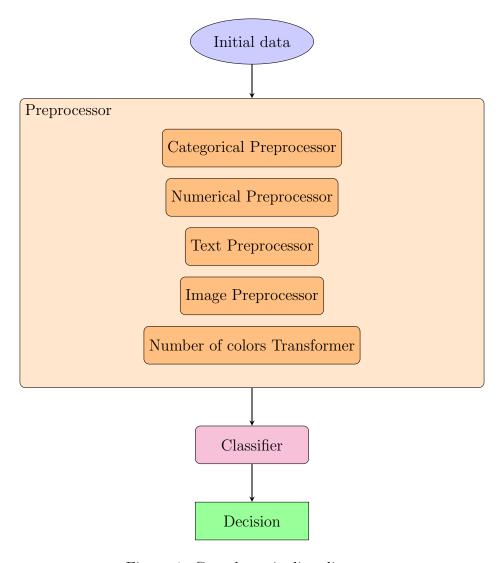


Figure 1: Complete pipeline diagram

- A Text Preprocessor
- A Image Preprocessor
- A Transformer for the number of colors

We detail the above in their respective paragraphs.

Categorical Preprocessor The Categorical Preprocessor is composed of a OneHotEncoder, which encodes categorical features as a one-hot numeric array. That is, for each of the categories, we create a new column with 1 if the initial column is of that category and 0 otherwise.

Numerical Preprocessor The Numerical Preprocessor contains a StandardScaler. Its role is to center and scale each of the numerical variables in order to remove differences in orders of magnitude.

Text Preprocessor The Text Preprocessor contains a TfidfVectorizer, which converts the raw comments from our text feature to a matrix of Term Frequency-Inverse Document Frequency (TF-IDF) features. We used a CountVectorizer initially, but it gave worse results than the TF-IDF, which is why we kept the latter. The CountVectorizer counts the occurences of each word in the *Description* column. A possible explaination of why the TfidfVectorizer performs better is that the features it produces not-only contain information about the frequency of each term, but they also account for the frequency of each word within the whole document.

Image Preprocessor The Image Preprocessor consists of a custom BOF_extractor. It extracts Scale-Invariant Feature Transforms (SIFTs) and computes Bag Of Features (BOF) on the images from the *Images* column.

Number of colors Transformer The Number of colors Transformer uses Function-Transformer to compute how many colors the animal has (*i.e.* colors different from "Unknown"). It then sets the number of colors as a feature.

3.3 Classification

3.3.1 Select Models

We did not test XGBoost because is too slow.

Classifier	Accuracy	
GradientBoostingClassifier	0.629	
RandomForestClassifier	0.623	
AdaBoostClassifier	0.612	
MLPClassifier	0.602	
$\operatorname{BernoulliNB}$	0.600	
GaussianNB	0.567	
DecisionTreeClassifier	0.559	
SVC	0.529	
KNeighborsClassifier	0.520	
GaussianProcessClassifier	0.509	
SGDClassifier	0.509	

Table 2: Accuracies of first prospect

3.3.2 Fine-tune hyperparameters

4 Evaluation & critical view

Glossary

BOF Bag Of Features. 3

 ${\bf SIFT}\,$ Scale-Invariant Feature Transform. 3

 $\mathbf{TF\text{-}IDF}$ Term Frequency-Inverse Document Frequency. 3