Feature Engineering in Machine Learning

Ayush Singh¹

Antern Department of Artificial Intelligence ayush@antern.co

Abstract. This document contains contents on data preparation in machine learning and we also cover several components of data preparation like feature engineering, feature selection, dimensionality reduction, etc. We provide readers with several traditional and modern techniques to handle complicated data tasks.

Key words: data preparation, feature engineering, feature selection, data cleansing, data transformation, dimensionality reduction

0.1 One Hot Encoding

For each distinct category in a nominal categorical variable, binary (0/1) features are created using the one-hot encoding technique. According to this method, a new binary column is created for each distinct category, with the existence of the category in an observation being represented by 1 and the absence by 0.

Advantages and Disadvantages:

Advantages	Disadvantages
Interpretability: One-hot encoding gener-	Increased Dimensionality: When the cat-
ates a binary feature for each category,	egorical variable has a large number of
making the connections between categories	distinct categories, one-hot encoding can
and the target variable simple to under-	greatly increase the dimensionality of the
stand.	dataset. This may result in the "curse of
	dimensionality" and increasing computa-
	tional complexity.
No Artificial Order: One-hot encoding is	
useful for nominal categorical variables be-	
cause, unlike label encoding, it does not	
impose an artificial order on the categories.	
Disadvantages:.	

Table 1. Advantages and disadvantages of one-hot encoding

Worked Example: Consider a dataset with the variable 'Animal' representing different animal species:

Animal		
Dog		
Cat		
Elephant		
Dog		
Elephant		

Using one-hot encoding, we create a new binary column for each unique category:

$\overline{\text{Dog}}$	Cat	Elephant
1	0	0
0	1	0
0	0	1
1	0	0
0	0	1

To perform one-hot encoding in Python, you can use the get_dummies function from the pandas library:

```
import pandas as pd

# Create a sample dataset
data = {'Animal': ['Dog', 'Cat', 'Elephant', 'Dog', 'Elephant']}
df = pd.DataFrame(data)

# Apply one-hot encoding to the 'Animal' column
encoded_df = pd.get_dummies(df, columns=['Animal'])

# Display the encoded dataset
print(encoded_df)
```

Animal_Cat	Animal_Dog	Animal_Elephant
0	1	0
1	0	0
0	0	1
0	1	0
0	0	1

Table 2. Output