

Name: Dave Mannion
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Bootcamp Capstone Report

Gene Family Prediction & ML

Machine Learning and DNA Sequence Classification

Dave Mannion

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Gene Family	Count	Class Label
G protein coupled receptors	531	1
Tyrosine kinase	534	2
Tyrosine phosphotase	349	3
Synthetase	632	4
Synthase	711	5
Ion channel	240	6
Transcription factor	1341	7

Table 1: Gene Families represented by Human DNA coding sequences.

1 Introduction

Here we examine NLP algorithms to develop a Machine Learning model for making predictions on sequences of Nucleic Acid text. Specifically, we train a Multinomial Naïve Bayes classifier on Human DNA Coding Sequences to predict Gene Families. In addition to Human sequences, predictive testing was also performed in Chimpanzee and Dog DNA coding sequences. [Table 1](#) above shows Gene Families in the dataset.

1.1 Motivation

This Capstone project was selected to provide an opportunity to explore NLP applications to biological text-based sequence data.

1.2 Exploratory Work

Prior to this Capstone project, recent work in ML applied to biological sequences was surveyed in order to identify the feasibility and scope of a project appropriate for this course. Method feasibility focused on LDA, NB and LSTM models. Some of this work is linked to Jupyter notebooks or original papers and includes protein classification¹, Sapien/Neandertal sequence classification², Neandertal DNA introgression³, CRISPR gRNA design tools⁴, Bacterial Classification with RNNs⁵, Bacteria taxonomic classifica-

¹<https://github.com/ai-dave/ml-gene-pub/blob/main/protein-classification.ipynb>

²https://github.com/ai-dave/ml-gene-pub/blob/main/Deep_Learning_on_Ancient_DNA.ipynb

³https://github.com/ai-dave/ml-gene-pub/blob/main/Deep_Learning_Neanderthal_Introgression.ipynb

⁴<https://pubmed.ncbi.nlm.nih.gov/31533522/>

⁵https://github.com/lelugom/wgs_classifier

tion⁶, Ribosomal RNA analysis^{7,8,9,10,11}, Taxonomy classification^{12,13}, Wolf/Dhole classification^{14,15,16}.

1.3 Capstone Project Work

Jupyter notebook for the Capstone Project is available from a github repo¹⁷.

⁶https://www.researchgate.net/publication/348432006_Bacteria_taxonomic_classification_using_Machine_learning_models

⁷<https://github.com/ai-dave/ml-gene-pub/blob/main/gnb-rdp.ipynb>

⁸<https://github.com/ai-dave/ml-gene-pub/blob/main/lda-compare-silva.ipynb>

⁹<https://github.com/ai-dave/ml-gene-pub/blob/main/lda-rdp.ipynb>

¹⁰<https://github.com/ai-dave/ml-gene-pub/blob/main/lstm-random-noise.ipynb>

¹¹<https://github.com/ai-dave/ml-gene-pub/blob/main/lstm-rdp.ipynb>

¹²https://github.com/ai-dave/ml-gene-pub/blob/main/ncbi_lstm_poc.ipynb

¹³<https://github.com/ai-dave/ml-gene-pub/blob/main/Eukaryota-Amoebozoa-Discosea.ipynb>

¹⁴<https://github.com/ai-dave/ml-gene-pub/blob/main/Dhole-Wolfe-LDA.ipynb>

¹⁵<https://github.com/ai-dave/ml-gene-pub/blob/main/Dhole-Wolfe-LSTM.ipynb>

¹⁶<https://github.com/ai-dave/ml-gene-pub/blob/main/Dhole-Wolfe.ipynb>

¹⁷<https://github.com/ai-dave/ml-gene-pub/blob/main/gene-family-human-chimp-dog.ipynb>

2 Data

2.1 Source

The data for this project came from a Kaggle notebook, DNA Sequencing with Machine Learning¹⁸.

2.2 Labeling

2.3 Preprocessing: K-Mer vectorization

2.4 Feature Extraction/Embedding

Use CountVectorizer to convert k-merized sequences to a matrix of token counts¹⁹.

2.5 Model Building

2.6 Model Performance

2.7 Model Deployment

¹⁸<https://www.kaggle.com/code/nageshsingh/demystify-dna-sequencing-with-machine-learning/data>

¹⁹https://scikit-learn.org/stable/modules/generated/sklearn.feature_extraction.text.CountVectorizer.html