DIFFICULTY ANALYSIS OF EXAM QUESTIONS

Developed and Presented by: Jayant Solanki - 50246821





Motivation

- To address the challenges faced in ensuring authenticity and fairness for Test-Takers to who attempt Online Exams
- The challenge is to ensure each question set for test-taker contains questions of similar difficulty levels
- Come-up with a web-application which will ensure that the questions are tagged with correct difficulty level for next iteration of Exam, using machine learning analysis on the performance of test-takers for previous exam.

Objectives Achieved

- Identification of the features in the Exam Question Data
- Development of Machine Learning Algorithm for predicting the difficulty levels or tags of the Question Data
- Provide User Interface for Question Creators with following features:
 - Provision for performing Machine Learning analysis on Selected Exam
 Data
 - Show analysis report on difficulty tagging for each year's Exam data
 - Show statistics for change in the tags, that is, deficits and excess, overall
 - Adding new Questions
 - Editing Previous Questions
 - User Management

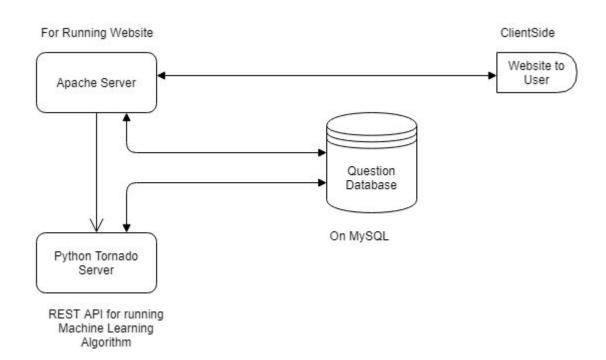
Methodology

- Each Exam year has a Question Bank of N Questions equally divided into 3
 Categories: Aptitude, Electronics and Programming
- Each question is tagged with a Difficulty Level: Easy, Medium, or Hard
- Following metrics are used for assessing the Difficulty levels:
 - Questions that require direct application of concepts and formulae are categorized as **Easy**
 - When solving a question involves extra processing such as application of assumptions and prior knowledge are categorized as **Medium**
 - Questions that require derivations and application of logic that involve multiple steps to arrive at a solution are categorized as **Hard**
- Each Test-Taker gets a Unique Question Set of 30 questions each having equal division in three categories and difficulty level in some fixed ratio

Methodology: continued

- Analysis on responses of Test-takers on previous Exams
- Identification of features such as:
 - the proportion of Test-takers who attempted a question
 - correctly answered a question,
 - incorrectly answered the questions,
 - response of top performers
- Application of several Machine Learning Algorithms such as K-Means Clustering, Neural Network and Autoencoder on the identified features
- Choosing the Algorithm with most accurate result, which was in this case
 K-Means Clustering
- Saving the predicted tags in the Mysql Database for the respective questions

Block Diagram





Tech-Stack Used

- Machine Learning
 - *Python 3.6*
 - Tornado for Rest Api
 - SQLAlchemy
 - Matplotlib for plotting the clusters
- Web Development
 - Laravel 5.4 with Symphony and Eloquent ORM
 - PHP 7
 - MySQL
 - Apache Server for deploying the Website
 - Bootstrap 3.6
 - Google Charts



Demo

Visit the Website



Room for Improvements

- Creation of Question Sets after the new difficulty level tags are obtained
- Adding Question Revision History
- Adding support for more Machine Learning Algorithm



Challenges faced

- Identification of proper features for the Machine Learning Analysis,
 acknowledging the fact that some of the question were incorrect
- Synchronising the Front-end and the Back-end Machine Learning
 Model
- Going through the awful iteration of User input validation and security testings
- Creating the Website with certain degree of action flow.



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