

A

Mini Project Report

on

**Early Warning System for Academic Performance**

Submitted in partial fulfillment of the  
Requirements for the award of degree of

**Bachelor of Technology**

in

**Computer Science and Engineering – Data Science**

by

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**DEPARTMENT OF DATA SCIENCE****CERTIFICATE**

This is to certify that the project entitled “**EARLY WARNING SYSTEM FOR ACADEMIC PERFORMANCE**” being submitted by **B. Sravan Kumar, P. Abhilash Reddy and P. Akhil Kumar** bearing the Hall Ticket numbers **20EG110103, 20EG110119 and 20EG110121** in partial fulfillment of the requirements for the award of the degree of the **Bachelor of Technology in Computer Science and Engineering – Data Science** to **Anurag University** is a record of Bonafide work carried out by them under my guidance and supervision from June 2023 to September 2023.

The results presented in this project have been verified and found to be satisfactory. The results embodied in this project report have not been submitted to any other University for the award of any other degree or diploma.

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# DECLARATION

We hereby declare that the project work entitled “**EARLY WARNING SYSTEM FOR ACADEMIC PERFORMANCE**” submitted to the **Anurag University** in partial fulfillment of the requirements for the award of the degree of **Bachelor of Technology** in Computer Science and Engineering – Data Science is a record of an original work done by us under the guidance of **Ms. B. Jyothi, Assistant Professor** and this project work have not been submitted to any other university for the award of any other degree or diploma.

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# ABSTRACT

The project's primary objective is to create an Early Warning System for Academic Performance in educational institutions, designed to identify students who may be at risk of facing academic challenges or falling behind in their studies. This system leverages data-driven indicators and analysis to gain insights into students' performance, ultimately determining whether they are in a precarious academic situation. The system's key function is to provide these insights to support staff within the educational institution promptly. By doing so, it empowers educators and administrators with the critical information they need to intervene and provide the necessary support to students who may be struggling academically. The implementation of such an early warning system for academic performance holds immense potential benefits for educational institutions. First and foremost, it enables institutions to proactively address academic challenges faced by students. This proactive approach can significantly improve student success rates, as timely interventions can prevent students from falling too far behind. Furthermore, the system fosters a more inclusive learning environment, as it ensures that no student's academic struggles go unnoticed. This inclusivity aligns with the broader goals of educational institutions to provide quality education and support to all students, regardless of their individual challenges. In summary, the Early Warning System for Academic Performance is a data-driven solution that empowers educational institutions to identify and address academic challenges promptly. This proactive approach can lead to improved student success rates and a more inclusive learning environment, ultimately benefitting both students and institutions alike.

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# 1. INTRODUCTION

Project revolves around the development of an Early Warning System for Academic Performance within educational institutions. This system is engineered to serve as a proactive mechanism for identifying students who may be at risk of encountering academic difficulties or falling behind in their studies. By harnessing the power of data-driven analytics and indicators, the system provides valuable insights into students' academic progress and alerts educators and administrators to potential issues. The primary goal is to ensure that students facing academic challenges receive timely support, thereby increasing their chances of success.

This project represents a significant step towards enhancing the educational experience within institutions. It underscores the importance of early intervention and support in addressing academic hurdles, ultimately contributing to improved student outcomes. The system's implementation not only aids individual students but also fosters a more inclusive and supportive learning environment within educational institutions. In essence, this project seeks to harness technology and data analysis to create a proactive and responsive framework for promoting student success and overall educational excellence.

## 1.1 Motivation

The motivation behind the project is to improve student success rates, reduce dropout rates, and foster a more inclusive learning environment. By identifying struggling students early on and providing timely interventions, educational institutions can support students in overcoming academic challenges. A proactive approach can help prevent academic deterioration and provide targeted resources and support to at-risk students.

## 1.2 Problem Definition

The lack of an effective early warning system for academic performance in educational institutions hampers the timely identification and support of students facing academic challenges. As a result, student success rates decline, and dropout rates increase. The project aims to develop a comprehensive data-driven system to proactively detect and address potential academic issues.

## 1.3 Objectives of the project

- Develop an early warning system that utilizes data-driven indicators to identify students at risk of academic challenges.
- To improve student success rates and reduce dropout rates.

## 2. LITERATURE REVIEW

Early warning systems for academic success encompasses a range of studies and sources, shedding light on the significance of these systems in education. Here, we provide an in-depth analysis of the key findings from the selected references.

**Systematic Review on Early Warning Systems (Carl & Johnson, 2022):** Carl and Johnson conducted a systematic review of the literature, aiming to provide a comprehensive overview of early warning systems' effectiveness in promoting academic success. Their research encompassed a wide array of studies and revealed that early warning systems play a pivotal role in identifying and supporting at-risk students. These systems utilize data-driven indicators to pinpoint potential academic challenges, enabling timely interventions. The study underscores the critical role of early warning systems in improving student outcomes and fostering a more inclusive learning environment.

**On-Track Indicator for Graduation (Allensworth & Easton, 2005):** Allensworth and Easton's research focuses on the "on-track indicator" as a powerful predictor of high school graduation. Their findings emphasize the importance of monitoring students' progress and identifying those at risk of falling behind. The on-track indicator serves as an early warning signal, allowing educators to implement interventions that can significantly impact graduation rates. This study highlights the practicality of using specific indicators to support students' academic journeys.

**Middle Grade Student Success (Balfanz & Herzog, 2005):** Balfanz and Herzog delve into the critical topic of keeping middle-grade students on track to graduation. Their research identifies middle school as a crucial juncture where students may start facing academic challenges. The study advocates for early interventions and strategies tailored to middle-grade students to prevent academic difficulties later on. It stresses the importance of proactive measures to ensure student success.

**Data Analysis for School Improvement (Bernhardt, 2004):** Bernhardt's work revolves around data analysis for continuous school improvement. The book provides educators with a framework for leveraging data effectively to enhance academic success. It underscores the importance of data-driven decision-making and the role of early warning systems in shaping educational strategies.

**Data-Driven Support (Data Quality Campaign, 2013):** The Data Quality Campaign's analysis focuses on supporting early warning systems through data utilization. The report emphasizes the critical role of data in identifying at-risk students and keeping them on track to success. It calls for data-driven approaches to inform decision-making and interventions, ensuring that students receive the necessary support.

**Dropout Prevention Guide (Dynarski et al., 2008):** Dynarski and her colleagues present a comprehensive dropout prevention guide. This guide offers evidence-based strategies and interventions to prevent student dropouts. It underlines the importance of early identification of at-risk students and the implementation of targeted interventions to support their academic progress.

Developing Early Warning Systems (Heppen & Therriault, 2008): Heppen and Therriault's research focuses on the development of early warning systems to identify potential high school dropouts. Their study emphasizes the need for proactive measures and the role of these systems in keeping students on track to graduation.

Collaborative Inquiry for School Improvement (Love, 2000): Love's work explores collaborative inquiry for school-based mathematics and science reform. It highlights the benefits of collaborative efforts among educators and the use of data to drive improvements in academic outcomes. The study showcases how a data-driven approach can enhance educational quality.

Philadelphia's Dropout Crisis (Neild & Balfanz, 2006): Neild and Balfanz examine the dimensions and characteristics of Philadelphia's dropout crisis. Their research provides critical insights into the challenges faced by educational institutions, especially in urban settings. It underscores the urgency of implementing early warning systems to address dropout rates effectively.

Massachusetts Early Warning Indicator System (Therriault & Jung, 2013): Therriault and Jung present the Massachusetts early warning indicator system as a practical example of how states are implementing these systems. This case study showcases how data-driven indicators can be used to support students' academic progress effectively.

Author Name	Carl, N., & Johnson, M.	Allensworth, E. M., & Easton, J. Q.	Balfanz, R., & Herzog, L.	Bernhardt, V.	Heppen, J. B., & Therriault, S. B.	Dynarski, M.
Advantages	Timely Identification of At-Risk Students	Targeted Interventions	Improved Graduation Rates	Personalized Student Support	Informed Decision making	Inclusive Learning Environment
Disadvantages	Data Privacy Concerns	Data Accuracy and Quality	Implementation Challenges	Resistance to change	Teacher Workload	Cost of Implementation
Future Enhancements	Integration with AI	Predictive Analytics for Early Detection	Enhanced Visualization and Reporting Tools	Mobile Applications for Accessibility	Customization for Diverse Educational Settings	Enhanced Data Security Measures

## 2.1 Early Warning Systems in Education: Advantages, Disadvantages, and Future Enhancements

## **3. ANALYSIS**

### **3.1 Existing System**

#### **3.1.1 Gradebook:**

The system that is used to track students' grades. Teachers can manually enter grades into the gradebook, and the system can then be used to identify students who are struggling academically.

#### **3.1.2 Attendance:**

The system that is used to track students' attendance. Teachers can manually enter attendance data into the system, and the system can then be used to identify students who are missing school frequently.

#### **3.1.3 Challenges of using manual systems for Early Warning System:**

Lack of consistency, different teachers may use different criteria for tracking student progress, which can make it difficult to compare students across classes or grade levels.

Time-consuming, manual systems can be time-consuming to maintain, which can make it difficult to keep up with the latest data.

### **3.2 Proposed System**

The proposed system will be a data-driven early warning system for academic performance. The system will collect and analyse a variety of data points, such as attendance, grades, assessment scores, credits, and behaviour incidents. Through data analysis techniques, patterns and trends will be identified, allowing the system to assess students' academic challenges and risk factors accurately.

### **3.3 Advantages over Existing System:**

#### **3.3.1 Comprehensive Data Analysis:**

It can handle large volumes of data, identifying patterns and trends that may be difficult to detect manually.

#### **3.3.2 Objective and Consistent Assessments:**

The system provides objective risk assessments based on predefined algorithms and criteria. This ensures consistency in identifying at-risk students, reducing the potential for subjective biases or oversight.

### 3.4 Software Requirement Specification

System Requirements:

Processor: Dual core i3 or equivalent.

RAM: 4GB.

Hard Disk: 128GB

Operating System:

Linux, Windows 10, macOS

Internet Connectivity

IDE:

Visual Studio Code

PyCharm

Python IDE

Languages:

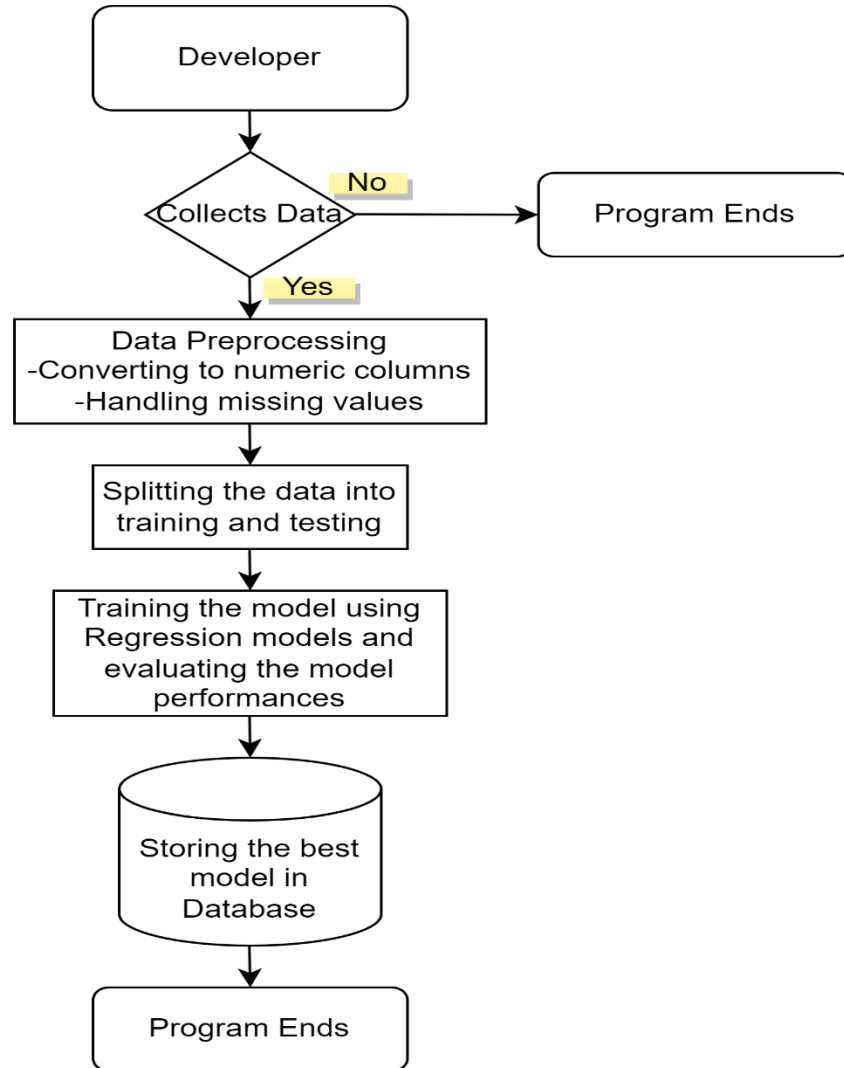
Python 3.10.11, HTML

Framework:

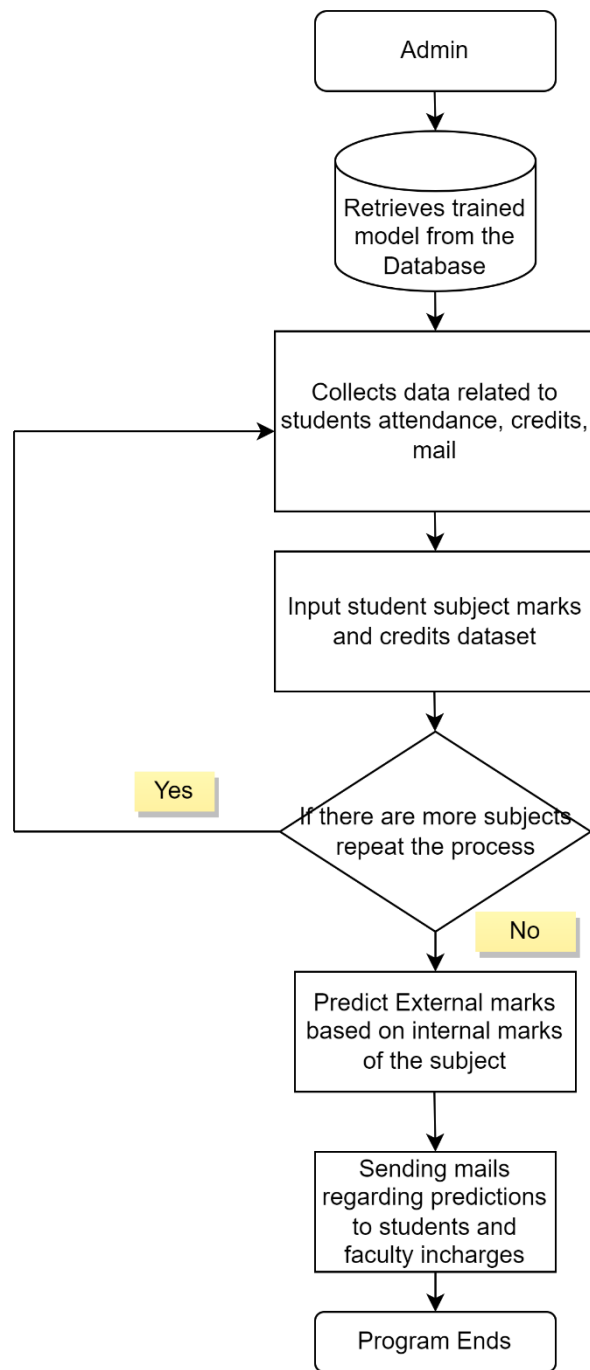
Django 4.2

## 4. Design

### 4.1 Block Diagrams



4.1.1 Block Diagram at Developer End



4.1.2 Block Diagram at User End

## 5. Implementation

### 5.1 Module Description

The project is a web-based Early Warning System (EWS) implemented using the Django framework, tailored to support academic institutions in enhancing student performance and success. The system begins with user authentication, ensuring secure access only to authorized personnel. It integrates with an SQLite database to store user information and other academic data. Notably, the project employs a machine learning model, specifically a Random Forest model, which is stored within the database as a binary blob. The model is loaded for predictive analysis later in the process.

Users are empowered to upload CSV files, containing attendance records and subject-specific data. These files are processed and merged into a unified DataFrame ('df') for further assessment. The system's core functionality lies in making predictions, particularly regarding external marks based on internal marks, utilizing the stored machine learning model.

Moreover, the project features an email notification mechanism. Students receive emails that provide insights into their academic performance, with the content tailored based on factors such as attendance, subject performance, and credit achievement. Additionally, administrative notifications are sent to a designated email address, summarizing students with low attendance, struggling subject performance, or insufficient credit attainment.

For user convenience, a logout functionality is available, ensuring the security of sensitive data by clearing session information. The 'urls.py' file handles URL routing within the application, directing specific URLs to corresponding view functions. Furthermore, the 'settings.py' file manages project configuration settings, encompassing database setup, internationalization, and static file serving.

In summary, this project serves as a comprehensive EWS tool that empowers educational institutions to monitor and proactively address academic challenges, promoting student success. It leverages machine learning for predictions and email notifications to facilitate effective communication between the system, students, and administrative staff.



### **5.1.1 Data Retrieval**

The module connects to an SQLite database (ews.db) to retrieve essential data, such as machine learning models and user credentials.

### **5.1.2 User Authentication:**

It facilitates user authentication by comparing entered login credentials (username and password) with those stored in the database. Upon successful authentication, users gain access to the system.

### **5.1.3 Data Prediction:**

This module utilizes machine learning models (particularly a Random Forest model) to predict students' academic performance based on their attendance records and internal assessment scores in various subjects. Predictions are made for each subject and student.

### **5.1.4 Data Integration:**

It integrates attendance data and subject-wise assessment data provided by users through CSV file uploads. This data is merged and processed for prediction.

### **5.1.5 Academic Criteria Assessment:**

The module assesses student performance based on attendance, internal assessment scores, and credit criteria to categorize students into different groups, such as those with low attendance, low subject scores, or low credits.

### **5.1.6 Communication:**

The module sends email notifications to students and faculty members based on their academic status. These emails include information about attendance, subject scores, and credits achieved.

### **5.1.7 Reporting:**

It generates HTML reports containing detailed information about student performance, including their hall tickets, attendance, subject scores, and credit status. These reports are displayed on the user interface for further analysis.

### **5.1.8 Email Notifications:**

The module sends email notifications to individual students, providing feedback on their academic performance and suggestions for improvement. It also sends summary emails to faculty members, notifying them of students with specific academic concerns.

### **5.1.9 Error Handling and Security:**

This module incorporates error-handling mechanisms to ensure the robustness of the system. It also addresses security concerns, such as protecting email credentials and sensitive data.

### **5.1.10 Database Connection:**

The module efficiently connects to and interacts with the SQLite database for data retrieval and storage.

#### **5.1.11 External Dependencies:**

The module relies on external libraries and packages, such as Pandas for data manipulation, Scikit-learn for machine learning, and Django for web application functionality.

#### **5.1.12 Integration with Email Services:**

It connects to email services through SMTP for sending email notifications, taking advantage of SSL encryption for secure communication.

#### **5.1.13 Module Dependencies:**

This module is dependent on the "Random Forest" machine learning model stored in the database (ews.db) and the associated database structure for user authentication.

## **5.2 Introduction to technologies used**

### **5.2.1 Django Framework:**

Django is a high-level Python web framework used for building web applications. In the code, Django is the primary technology used for creating web applications and handling user requests and responses.

### **5.2.2 SQLite Database:**

SQLite is a lightweight, serverless, self-contained database engine used for local data storage. In the code, SQLite is employed to store and retrieve data, including machine learning models and user credentials.

### **5.2.3 Pandas Library:**

Pandas is a popular Python library for data manipulation and analysis. It provides data structures like DataFrames that allow for efficient data handling and manipulation. In the code, Pandas is used for processing and merging data from CSV files.

### **5.2.4 Scikit-Learn Library (Machine Learning):**

Scikit-Learn is a machine learning library for Python. In the code, Scikit-Learn is used for making predictions using machine learning models. Specifically, it uses a Random Forest model to predict students' academic performance.

### **5.2.5 SMTP (Simple Mail Transfer Protocol):**

SMTP is a communication protocol for sending emails. The code uses SMTP to send email notifications to students and faculty members regarding academic performance. It connects to an SMTP server for email transmission.

### **5.2.6 EmailMessage (from email.message):**

The EmailMessage class from the email.message module is used to create email messages. It allows the code to specify the sender, recipient, subject, and body of email notifications.

### **5.2.7 SSL (Secure Sockets Layer):**

SSL is a protocol for secure data transmission over a network. In the code, SSL is utilized for secure SMTP communication when sending email notifications.

### **5.2.8 Joblib Library:**

Joblib is a library for lightweight pipelining in Python. In the code, it is used for loading machine learning models (Random Forest) from binary files stored in the database.

### **5.2.9 Django Templates:**

Django templates are used for rendering HTML content dynamically. In the code, Django templates are likely used for generating web pages with dynamic data, such as the prediction results and email notifications.

#### **5.2.10 File Upload Handling:**

The code handles file uploads using Django's built-in capabilities for processing and reading uploaded CSV files. This is crucial for gathering data from users.

#### **5.2.11 Exception Handling:**

Exception handling is a fundamental part of Python and is used throughout the code to catch and handle errors gracefully. It ensures that the application continues to run smoothly even when issues arise during execution.

These technologies and libraries collectively enable the code to create a web-based academic performance prediction and notification system. They facilitate data manipulation, machine learning, email communication, and user authentication, resulting in a comprehensive solution for managing and enhancing academic performance tracking and support in an educational context.

## 5.3 Sample Code

```
from django.shortcuts import render
from django.http import HttpResponse
import sqlite3
import pandas as pd
import warnings
warnings.filterwarnings("ignore")
from email.message import EmailMessage
import ssl
import smtplib
# Create your views here.
import joblib
from io import BytesIO
import re
def retrieve():
    global loaded_model
    conn = sqlite3.connect('ews.db')
    try:
        cursor = conn.cursor()
        query = "SELECT model_blob FROM model WHERE model_name = ? AND id = ?"
        cursor.execute(query, ('Random Forest', 1))
        result = cursor.fetchone()

        if result:
            model_binary = result[0]
            model_file = BytesIO(model_binary)
            loaded_model = joblib.load(model_file)
        else:
            print("Model not found in the database.")
    finally:
        cursor.close()
        conn.close()
```

```

def home(request):
    return render(request, 'login.html')

def login(request):
    db_file_path = r'C:\Users\srava\Documents\Python\ews.db'
    conn = sqlite3.connect(db_file_path)
    cursor = conn.cursor()
    retrieve = """select username from users;"""
    cursor.execute(retrieve)
    dbuser = cursor.fetchall()
    retrieve = """select password from users;"""
    cursor.execute(retrieve)
    dbpwd = cursor.fetchall()
    cursor.close()
    conn.close()
    user = request.POST.get('username', "")
    pwd = request.POST.get('password', "")
    if user==dbuser[0][0] and pwd==dbpwd[0][0]:
        return render(request, 'user.html')
    else:
        return HttpResponseRedirect('Username or password is wrong')

```

## 5.4 Sample Datasets

	A	B	C	D	E	F	G	H	I	J	K	L	M	N
1	MID 1	MID 2	MID 3	MID	Quiz 1	Quiz 2	Quiz 3	Quiz 4	Quiz 5	Quiz	Assignmen	Assignmen	Assignmen	Internal
2	14	16	--	15	8	8	5	9	8	8	9	9	9	32
3	20	20	0	20	9	8	10	9	10	9	10	10	10	39
4	20	20	0	20	9	9	10	8	10	9	10	10	10	39
5	20	19	0	20	9	8	10	8	10	9	10	10	10	39
6	18	15	0	17	9	9	10	9	10	9	10	10	10	36
7	20	17	0	19	9	9	10	8	10	9	10	10	10	38
8	20	17	0	19	9	8	10	9	10	9	10	10	10	38
9	17	17	0	17	9	8	10	8	10	9	10	10	10	36
10	17	17	0	17	9	9	10	9	10	9	10	10	10	36
11	17	17	0	17	9	8	10	9	10	9	10	10	10	36
12	18	17	0	18	9	9	10	8	10	9	10	10	10	37
13	16	17	0	17	9	9	10	8	10	9	10	10	10	36
14	14	11	--	13	7	7	5	5	5	6	5	5	5	23
15	20	20	0	20	9	8	10	9	10	9	10	10	10	39
16	13	15	0	14	9	8	10	9	10	9	10	10	10	33
17	16	19	0	18	9	8	10	8	10	9	10	10	10	37
18	15	17	--	16	7	7	10	10	7	8	5	5	5	29
19	17	20	0	19	9	9	10	9	10	9	10	10	10	38
20	0	12	--	6	8	8	8	5	7	7	5	9	7	20
21	18	20	0	19	9	9	10	9	10	9	10	10	10	38
22	18	17	0	18	9	8	10	9	10	9	10	10	10	37
23	0	17	18	18	9	9	10	8	10	9	10	10	10	37
24	18	18	0	18	9	9	10	8	10	9	10	10	10	37
25	18	17	0	18	9	9	10	8	10	9	10	10	10	37
26	15	12	0	14	9	9	10	9	10	9	10	10	10	33
27	19	16	0	18	9	8	10	8	10	9	10	10	10	37
28	17	16	0	17	9	8	10	8	10	9	10	10	10	37

5.4.1 Training Dataset

	A	B	C	D	E	F	G
1	HallTicket	Attendanc	Student en	Incharge e	Credits ac	Total Credits	
2	1	68	thorlovear	sravan090	92	100	
3	2	96	thorlovear	sravan090	100	100	
4	3	65	thorlovear	sravan090	100	100	
5	4	40	thorlovear	sravan090	62	100	
6	5	84	thorlovear	sravan090	100	100	
7	6	73	thorlovear	sravan090	100	100	
8	7	78	thorlovear	sravan090	98	100	
9	8	96	thorlovear	sravan090	100	100	
10	9	86	thorlovear	sravan090	90	100	
11	10	72	thorlovear	sravan090	100	100	
12							
13							
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28							

5.4.2 Attendance, Credits, and communication details Dataset

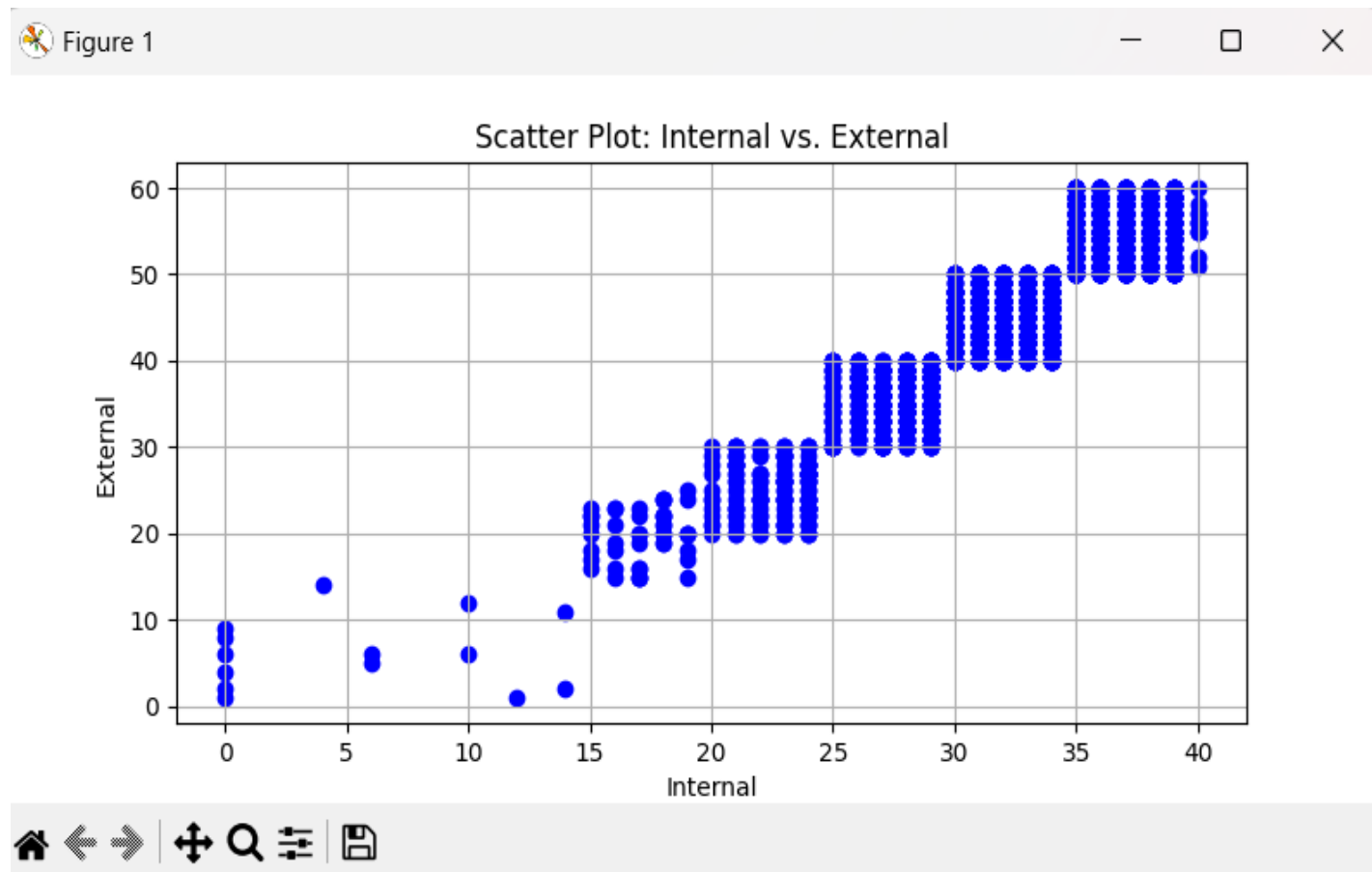
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q
1	Ref Code	HallTicket	MID 1	MID 2	MID 3	MID	Quiz 1	Quiz 2	Quiz 3	Quiz 4	Quiz 5	Quiz	Assignmen	Assignmen	Assignmen	Internal	Credits
2	AI	1	0	16	13	15	9	8	10	0	7	6.8	0	10	5	15	4
3	AI	2	14	10	0	12	9	10	8	10	8	9	10	10	10	31	4
4	AI	3	19	16	0	18	9	9	10	10	7	9	10	8	9	36	4
5	AI	4	0	0	0	0	0	0	0	10	7	3.4	0	0	0	3	4
6	AI	5	13	17	0	15	9	5	10	0	8	6.4	10	10	10	31	4
7	AI	6	18	7	17	18	9	6	9	8	9	8.2	10	10	10	36	4
8	AI	7	15	14	0	15	0	10	10	0	9	5.8	0	10	5	17	4
9	AI	8	17	14	0	16	9	9	10	0	8	7.2	10	10	10	33	4
10	AI	9	9	11	0	10	10	0	9	0	7	5.2	0	8	4	19	4
11	AI	10	7	4	10	8.5	10	10	9	9	9	9.4	10	8	9	27	4
12																	
13																	
14																	
15																	
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24																	
25																	
26																	
27																	
28																	

Sravan Kumar (SravanKumar@skolutions99.onmicrosoft.com) is signed in

### 5.4.3 Subject details



## 5.5 Results



5.5.1 Scatter Plot Internal vs. External

None							
	MODEL	MSE	MAE	R2_SCORE	RMSE	RMSE (CROSS-VALIDATION)	
1	RidgeRegression	17.859839	3.430458	0.841356	4.226090	4.296113	
0	LinearRegression	17.859818	3.430451	0.841356	4.226088	4.296114	
2	SVR	11.334449	2.836980	0.899319	3.366667	3.956851	
3	RandomForestRegressor	9.766360	2.658445	0.913248	3.125118	3.191343	

5.5.2 Accuracy Results

## Welcome to Early Warning System for Academic Performance

### Login to continue

Admin ID

Password

Login

Dear Customer,

Welcome to the login page of Early Warning System for Academic Performance.  
Its lighter look and feel is designed to give you the best possible user experience.  
Please continue to login using your Admin ID and password.

### 5.5.3 Login Page

## Attendance and Subjects

Attendance File (CSV only):

Choose File

No file chosen

Subject Files (CSV only):

Choose File

No file chosen

Add More Subjects

Submit

### 5.5.4 File upload page

HallTicket	Attendance	Student email	Incharge email	Credits achieved	Total Credits	ExternalAI	ExternalCAA
1	68	thorloveandthunder74@gmail.com	sravan090901@gmail.com	96	108	35.533773	79.007202
2	96	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	75.542394	90.130334
3	65	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	90.743027	93.103193
4	40	thorloveandthunder74@gmail.com	sravan090901@gmail.com	62	108	10.442880	39.534501
5	84	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	75.542394	91.882957
6	73	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	90.743027	90.743027
7	78	thorloveandthunder74@gmail.com	sravan090901@gmail.com	102	108	36.901823	76.930375
8	96	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	77.616285	90.130334
9	86	thorloveandthunder74@gmail.com	sravan090901@gmail.com	94	108	39.534501	90.743027
10	72	thorloveandthunder74@gmail.com	sravan090901@gmail.com	108	108	61.667324	74.910201

Send Alerts

#### 5.5.5 Predicted Results Page



20eg110103@gmail.com 19:19

to me ▾



Chances of getting detended due to lack of attendance and credits.

Try to improve more in the following subjects

AI

CAA

DS

ED

EEES

Your attendance percentage is 40

#### 5.5.6 Mail sent to the Student



20eg110103@gmail.com 14:28  
to me ▾



[Hide quoted text](#)

The following students are in the list of low attendance with  
HallTicket Numbers

1  
3  
4

The following students are in the list of low marks in subjects  
HallTicket Numbers

1  
4  
7  
9

The following students are having low credits  
HallTicket

4

5.5.7 Mail sent to the Incharge

## 6. Conclusion

In summary, the "Academic Performance Prediction and Notification System" represents a significant advancement in leveraging technology to enhance the educational experience. This comprehensive system, built on a foundation of Django, SQLite, Pandas, Scikit-Learn, SMTP, and SSL, provides a multifaceted approach to academic performance management. Its prowess in data integration and processing ensures that student information from diverse sources is seamlessly consolidated, fostering a holistic view of their academic journey. The machine learning-powered predictive modeling, facilitated by Scikit-Learn's Random Forest, empowers educators with early insights into potential academic challenges, enabling timely and targeted interventions. Moreover, user authentication and access control mechanisms prioritize data security and privacy, ensuring that sensitive academic information remains confidential. The system's adeptness in email communication through SMTP, backed by the EmailMessage class, bridges the gap between students and faculty, delivering personalized feedback and guidance to promote academic excellence. Notably, robust error handling mechanisms fortify its resilience in the face of unexpected scenarios, contributing to its overall reliability. Furthermore, the generation of HTML reports offers a user-friendly means of reviewing and analyzing academic data, facilitating data-driven decision-making. In an educational landscape characterized by ongoing evolution, the "Academic Performance Prediction and Notification System" stands as a beacon of progress, championing proactive academic support and communication. By harmoniously combining these functionalities, this system not only empowers students to gain insights into their academic standing but also equips educators with the tools necessary to provide timely assistance, ultimately fostering a conducive environment for academic success. In a world where technology continues to shape the future of education, systems like this one represent a transformative force, ensuring that every student can thrive academically and reach their full potential.

## **7. Future Enhancement**

The academic monitoring project presented here has a strong foundation, and its future enhancements can make it even more impactful. One significant improvement could be the implementation of a comprehensive notification system. This system could send automated alerts to students about their attendance, performance in specific subjects, and upcoming assignments or exams. Additionally, teachers and administrators could receive notifications about students with consistently low attendance or struggling in particular subjects, enabling timely intervention. Moreover, integrating a chatbot or AI-based virtual assistant could provide students with instant answers to academic queries and guidance on study materials. Another valuable feature could be the integration of an online library or resource center, allowing students to access relevant study materials and resources easily. Gamification elements, such as achievement badges for attendance and academic milestones, can motivate students further. Lastly, incorporating data analytics and visualization tools can provide valuable insights into student performance trends, helping educators tailor their support accordingly. These enhancements would transform the project into a comprehensive academic support system, promoting student success and efficient administrative management.

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