University of Suffolk School of Engineering Arts, Science and Technology

Module: Data Mining and Statistics

Module Tutor: Dr Adnane Ez-zizi

Assessment: Technical Report

on or before 15/03/2024

Word count: 3000

Module Rationale

Data science includes many techniques for classification, analysis and prediction. This module focuses on those techniques relating to data mining and statistically driven approaches. These techniques also have the advantage of being "explainable AI", more so than deep learning approaches, and some are long established techniques of "business intelligence".

Aims

Through the completion of this module students will:

- 1. Develop a comprehensive understanding of data mining, business intelligence and statistical AI techniques, extending their research skills especially in terms of quantitative analysis
- 2. Learn how to discern which technique is most appropriate for a given scenario
- 3. Be able to apply and derive clear insights from relevant techniques, with the ability to articulate the limits, constraints and statistical soundness of the insights.

Learning Outcomes

On successful completion of this module, a student will be able to:

- 1. Demonstrate substantial knowledge and systematic understanding of theory, techniques and applications of data mining, business intelligence, statistical AI and quantitative analysis
- 2. Assess which techniques are most appropriate for a particular scenario
- 3. Create an effective robust solution applying appropriate techniques to a particular scenario
- 4. Derive clear insights from the solution, articulating the limits and statistical soundness of the insights

Assessment: Technical Report Overview

You are expected to write a technical report in order to pass this module. The objective of the technical report is to explore a data set, answer predefined research question(s) and complete the analysis or model building to solve the proposed research question(s). The flow, look and feel of the technical report could be similar to a typical scientific paper or the template reports provided as part of this assessment brief (see https://brightspace.uos.ac.uk/d2l/le/content/66777/Home).

Activities include:

- Defining the problem and motivating its importance (for this you will need to include an introduction and a literature review)
- Describing the data set
- Cleaning and preparing the data for modelling (e.g., dealing with missing values, transforming features, creating new features)
- Exploring the data using statistical summary measures (e.g., percentages, mean, median, standard deviation) and graphs (e.g., bar chart, line graph, histogram)
- Defining an experiment setup
- Implementing your proposed approach
- Evaluating and analysing your approach
- Showing statistical significance testing results if and as appropriate

Problem statement:

The Open University built a dataset capturing their students' learning between 2013 and 2014. The information encoded in the dataset includes the demographic and educational background of students, their interactions with the University's virtual learning environment and assessment results. The dataset is available at: https://analyse.kmi.open.ac.uk/open_dataset.

Imagine you have been hired as a data scientist by the Open University to analyse this dataset and answer the following question: "Could we predict whether a student will withdraw or not from a course based on their personal information and how they interact with the virtual learning environment?" As you can imagine this has a lot of value for the University as well as for students. This is because detecting students at risk of withdrawal early on can allow the University to make early interventions to support the students that need help the most (given that University resources are not illimited).

Structure of the report

Suggested sections of the technical report are described below. You must have the abstract, introduction, methods, results and discussion sections.

Abstract (~250 words)

Overall summary of your project including motivation, research problem, methods, main findings (e.g. model performance and evaluation) and any conclusions that could be drawn.

Introduction and background (~500 words)

Introducing the research/technical problem that you intend to solve and an overall summary of the issue with the set of research questions that you will be pursuing. You should also include a short critical literature review to motivate the research questions that you will be pursuing. The literature review should <u>not</u> be merely descriptive but should be critical in nature, with a view to highlighting the value and importance of your work.

Methods and Experimental Setup (~1,000 words)

Data Description

Describe the data and any issues it might have (e.g., missing values, skewed data).

Data Preprocessing

Describe any steps you undertook to prepare the data for statistical and machine learning analyses. This includes, for example, creating the outcome variable "withdrawal" based on whether a student withdrew from the course or complete it, as well as feature engineering steps (e.g. how to encode the interactions with the virtual learning environment).

Statistical and Machine Learning Methods

Describe the methods/tools you chose to address your research question(s). This could include:

- Stating null and alternative hypotheses.
- Describing how you will quantify reliability e.g. significance testing, confidence intervals. If appropriate, describe how you will measure effectiveness e.g. regression r-square, clustering evaluation, classification f1-score.
- Describe any machine learning or statistical techniques that you will be using, the selected features, model tuning and parameter selection approach.
- Explain how the analysis will answer your research question(s).

Results (~750 words)

- Exploratory data analyses
- Summarise results, reliability and comparison to any benchmark analyses or models.
- Critically analyse results e.g. limitations of data, setup or approach, characteristic errors, feature importance analysis, possible improvements
- Conclude with what you have learned from this study which would improve yourself as a data scientist. Would you recommend this as a solution to your problem? Provide reasons.

Discussion and Conclusion (~500 words)

- Interesting discussion around the results
- Discussion around the limitations of the study
- Future directions
- Overall conclusions

You will also be marked based on the Python code that you use to run your analyses and generate your results as described below.

Supporting Python Code

- The code should be submitted as a **SINGLE Jupyter Notebook**, and should replicate all the results presented in your report.
- Different parts of your Python script should include comments to make it easy to follow what you have done. Divide your notebook into separate sections, each referring to one part of the analysis (e.g. Data Preprocessing, Data Exploration, Data Modelling).
- All the outputs should be generated within the Jupyter Notebook.

You will also be marked on the clarity and readability of your report. Therefore, use a formal academic writing style and make sure your final report is edited and does not contain grammatical or spelling issues. The report may include sub-level or other high-level headings as necessary.

Submission Requirements

- 1. Ensure that your work is submitted as a SINGLE Word document or PDF with a filename matching the pattern sXXXXXX.doc or SXXXXXX.pdf where sXXXXXX is your UoS userid. Ensure that the document is marked with your UoS userid. Your name should not appear anywhere in the files.
- 2. Your report should use a line spacing of 1.5 and a body font size of 12pt.
- 3. Ensure that you submit your supporting Python code as a separate Jupyter Notebook (i.e., "ipynb" file) with all code outputs generated. In other words, submit your report and code on Brightspace as two separate files, so Turnitin can check your report for plagiarism.
- 4. If your submission exceeds the word count by up to 10% then there will be no penalty applied. Submissions that exceed the word count by more than 10% will be applied a fixed penalty of 5 percentage points (i.e., 5 marks). In all cases, the penalised mark will not be reduced below a pass level, assuming the work merits a pass. Tables, diagrams (including associated legends), appendices, reference lists, tables of contents, footnotes, and endnotes are excluded from the word count but should be used appropriately. It is for the Module Leader to decide if there is excessive or inappropriate use of components excluded from the word count.
- 5. All bibliographies must be formatted according to Harvard style.
- 6. Your submitted report will be checked for plagiarism using Turnitin and any plagiarism

- detected will be dealt with seriously according to the University's policy for plagiarism, so paraphrase and cite your references carefully.
- 7. Remember that you can run a similarity report check once before submission by uploading your report document to the Similarity Report Check folder.
- 8. The use of AI to assist in completing the assignment is not permissible, except for the following tasks:
 - i. Proofreading
 - ii. Media creation for aesthetic purposes
 - iii. Code assistance, as you would use google search or StackOverflow (i.e. no substantial code generation from scratch).
 - iv. Literature resource search
 - v. Any other use should be discussed and agreed upon with the tutor

If you have employed AI tools, you must include an acknowledgment section specifying how they were used (the content of this section will not be included in the word count). Select and adapt the appropriate statement below:

- 1. "I attest that this project did not use AI at any stage in its development or in the creation of any of its components."
- 2. "I attest that this project made use of AI in the following ways: ". You must then use the following table to document your usage.

Usage	Tool Used (e.g., ChatGPT-4, Elicit)	How you edited the output, if at all	Conversation Link (If available)
Search of relevant			
literature			
Media Creation			
Proofreading			
Other			

Assessment Rubric:

The following rubrics will be used in the marking of your assessment:

Assessment Criterion	Max	> 75%	50% – 74%	25% – 49%	< 25%
	marks				
Abstract:	10	Fully or mostly	Adequately fulfilled	Partially fulfilled (2.5	Minimally or none
The abstract		fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
succinctly summarises					
the research, including					
the purpose,					
methodology, and					
findings. It clearly					
outlines the scope and					

objectives of the study			l	l	1
and provides a brief					
overview of the					
results and					
conclusions drawn.					
	10	Enller on months	A 4	Dentialla falfilla 4 (2.5	Minimalla anna
Introduction and		Fully or mostly fulfilled (7.5 – 10pts)		Partially fulfilled (2.5 – 4.99pts)	fulfilled (0 – 2.49pts)
background:			(c ///pc)	1.22 pts)	Tummed (0 2.15pts)
The problem is well					
defined, and its					
significance is clearly					
and logically argued					
for. The topic is					
placed in context					
within its field, and					
the literature is well					
synthesised.					
Methods:		Fully or mostly		Partially fulfilled (7.5	
The discussion of the		fulfilled (22.5 – 30pts)	(15 – 22.49pts)	– 14.99pts)	fulfilled (0 – 7.49pts)
methodology		Sopis)			
demonstrates an					
appropriate selection					
of research methods to					
answer the stated					
research questions,					
including the					
description of the					
data, data pre-					
processing and					
statistical and machine					
learning procedures					
Results:	30	Fully or mostly	Adequately fulfilled	Partially fulfilled (7.5	Minimally or none
Rigorous analysis of		fulfilled (22.5 –	(15 - 22.49 pts)	– 14.99pts)	fulfilled (0 – 7.49pts)
the data using tools		30pts)			
and techniques					
appropriate to the					
field. Clear, concise					
and correct					
explanation of the					
results with the help					
of diagrams and					
tables.					
Discussion and	10	Fully or mostly	Adequately fulfilled	Partially fulfilled	Minimally or none
Conclusion:		fulfilled (11.25 –	(7.5 - 11.24 pts)		fulfilled (0 – 3.74pts)
The discussion and		15pts)	r/	, , , , , , , , , , , , , , , , , , ,	
conclusion offer a					

concise yet thorough				
understanding and				
synthesis of the				
research outcomes,				
linking them				
effectively to the				
aims, objectives,				
and/or research				
questions. The				
discussion addresses				
the study's limitations				
and future directions.				
Python Code:			Partially fulfilled (2.5	
Code is submitted in	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
Code is submitted in the required format	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format and is well	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format and is well documented. It can	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format and is well documented. It can replicate all the	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format and is well documented. It can replicate all the analyses reported	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)
the required format and is well documented. It can replicate all the analyses reported without issues and all	fulfilled (7.5 – 10pts)	(5 – 7.49pts)	– 4.99pts)	fulfilled (0 – 2.49pts)