Aprenentatge Automàtic 1 (GCED) Project Guidelines, Spring 2020

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Abstract

This is a brief guide for the correct development of the practical work of the course (the **project**). The students must apply the different concepts and models learnt during the course to solve a real problem, providing a feasible solution intended for the final user. The students must write a complete **report** describing the work carried out, the problems encountered and the solutions envisaged, as well as the final results and conclusions of the study.

Please read this document carefully!

1 General Information

There are two basic possibilities to develop a term project.

- Choose a practical problem from one of the provided data repositories or specific problems (see below) and develop a solution (a classification or regression model);
- Bring your own problem (theoretical, practical or both); in this case you are responsible for getting the necessary data, if needed

In both cases –but especially in the latter– you will need to announce your choice and get the "go ahead" answer from the teachers.

The most important guidelines are:

- 1. You can choose to explore any problem that motivates you. In every case, you are expected to write a complete report describing the work carried out, its motivation, the problems encountered and the solutions envisaged, and the final results and conclusions of the study. The final main text is (strictly) limited to 14 pages;
- 2. It is expected that you make a proposal for the project for preliminary evaluation. Proposals should be submitted through the "Racó" no later than March 23rd, 2020. Submit your proposal as a 1-page pdf; it is enough that one member of the team submits this through the "Racó". Your project proposal should specify: which problem you want to tackle, why you choose this problem, a couple of fundamental references, a preliminary title, and a list of team members;
- 3. The delivery is split in two deliverables (see below), one in the middle of the semester and one at the end;
- 4. The computer language used for the modeling part must be R (http://cran.r-project.org/). Remember that there are many useful packages for R which you can use to extend its basic capabilities. Pre-processing or any other non-modeling tasks may be done in any other languages of your choice;
- 5. If needed, additional information on the methods or on the problems may be obtained. Some of the web repositories (see Section 4) contain previous usage of the data; information can also be gathered from textbooks, other courses, domain experts, the web ... and maybe from the teachers. Please acknowledge or cite properly everything you use.

2 Deliverables and delivery mechanism

2.1 Final delivery

The final report should include:

- 1. A description of the work and its goals, the available data, and any additional information that you have gathered and used
- 2. A description of related previous work (if applicable)
- 3. The data exploration process (pre-processing, feature selection/extraction, clustering, visualization, etc)
- 4. The resampling protocol; the modelling methods considered, reasoning the choice
- 5. The results obtained with each chosen method (along with the best set of parameters) and a comparison of these results
- 6. The final model chosen and an estimation of its generalization error
- 7. Scientific and personal conclusions
- 8. Possible extensions and known limitations
- 9. References

You will be required to submit the full code and a brief text file with instructions on how to execute your code (make sure that your results are *reproducible*, for example, by using "seeds" in random processes, etc.). Nothing needs to be delivered on paper. The report should *not* include technical explanations seen in class; please do not include tables or plots without explanation.

All deliveries are to be made exclusively through the "Racó". An appropriate mechanism will be prepared for every delivery. For the final delivery, please be sure to include the following (please compress everything into a single file):

- A document (written report). This document has to open with a standard pdf reader and should not exceed 14 pages. If more space is really needed, place information of secondary importance in a separate appendix file
- 2. One or more text files (.r or .R) containing all the necessary R code
- 3. Additional files with the rest of the code in other languages (perl, python, awk, etc) that you may have used (e.g., for pre-processing or plotting)
- 4. A flat text file with precise instructions on every step needed to reproduce your final results

2.2 Intermediate delivery

The mid-report should include:

- 1. A brief description of the work and its goals and the available data
- 2. A brief description of related previous work (if applicable)
- 3. The data exploration process (pre-processing, feature selection/extraction, clustering, visualization, etc)
- 4. The resampling protocol; the modelling methods considered (up to those seen in class at the moment), reasoning the choice
- 5. Preliminary results obtained with each chosen method (along with the best set of parameters) and a comparison of these results
- 6. A few basic references

At this point you are only required to submit the report (not any piece of code).

3 Evaluation

The grade will be partly based on the clarity of your report, so please make sure your final report is well organized and clearly written. There should be an introductory part explaining the basics of your work, and a conclusions section, basically stating what you know compared to what you knew before the work started; also any gaps, possible extensions or limitations in your development should be noted and explained. Your work will also be evaluated based on technical quality. This means that the techniques you use should be reasonable, the stated results should be accurate, and technical results should be correct and complete, whether they are your own work or not.

In summary, these are the conditions for a high score (in this order!):

- 1. The (proper) use of techniques and methods presented in class
- 2. The care and rigor for obtaining the results (resampling protocol, quality metrics, statistical significance)
- 3. The quality of the obtained results (generalization error, simplicity, interpretability)
- 4. The quality of the written report (conciseness, completeness, clarity)

4 Data repositories

You can browse the following data repositories:

- Open ML https://www.openml.org/search?type=data
- UCI Repository http://archive.ics.uci.edu/ml/index.php
- UCI KDD Archive http://kdd.ics.uci.edu/summary.data.application.html
- The Statlib database http://lib.stat.cmu.edu/datasets/
- The Delve project http://www.cs.utoronto.ca/~delve/data/datasets.html
- The School of Informatics (University of Edinburgh) repository: http://www.inf.ed.ac.uk/teaching/courses/irds/miniproject-datasets.html
- Luis Torgo's compilation of datasets (regression only) http://www.dcc.fc.up.pt/~ltorgo/Regression/DataSets.html

You have to choose *one* of the problems. Most of the problems are real-world tasks. Their origins are very diverse, not only regarding the area of work (biology, geophysics, medicine, etc) but because they show different data characteristics. For example, there are great differences in the number of variables and examples, number of classes, intrinsic difficulty, lost values, various errors, mixed nominal and/or continuous variables, etc. Other problems are synthetic (they have been generated by a program), and their characteristics are completely known. However, their study is interesting for a number of reasons, including meaningful (as well as significant) comparisons of different learning algorithms.

Some problems are easier in some aspects and more difficult in others. Therefore, the selection of the particular problem does not have a lot of importance for the grade. In particular, it is not at all advisable that you start to test problems to see how they "behave". It is recommended that you make the decision by the interest that it raises in you.

The main "warning" we give is to be aware of the large computational needs that some (or many) of the chosen methods may have. If you choose a problem with a number of rows in the order of 10^5 or more, you will surely get into serious demands of CPU and RAM ... Unless you do something to reduce these needs, it is wise to keep this number in the order of $10^2 - 10^4$.

5 Key dates

- March 23rd, 2020. Project proposals (1-page pdf file)
- April 27th, 2020. Preliminary report and code (7-page pdf file)
- June 15th, 2020. Final report and code (14-page pdf file)

Remember: The project is to be developed in **groups of 2 people**; one or two groups of 3 people will be allowed subject to an explicit ack and based on a reasonable cause. Only one member of each team should submit information (always via the "Racó" at https://raco.fib.upc.edu). For your convenience, a "Forum" is open starting today, to facilitate the finding of mates.