STA 314: Statistical Methods for Machine Learning I

Overview

Machine learning (ML) is a set of techniques that allow computers to learn from data and past experience, rather than requiring humans to specify the desired behaviour by hand. ML has become increasingly central both in statistics as an academic discipline, and in the data science industry. This course provides a broad introduction to commonly used ML methods, as well as the key statistical concepts underlying ML. It serves as a foundation for more advanced courses, such as STA414 (Statistical Methods for Machine Learning II).

We will cover popular statistical methods for supervised and unsupervised learning from data as well as important concepts used in the field, including: training error, test error and cross-validation; classification, regression, and logistic regression; variable selection; penalized regression; principal components analysis; stochastic gradient descent; decision trees and random forests; k-means clustering and nearest neighbour methods. Computational tutorials will support effective application of these methods.

Prerequisites

- Statistics & probability: STA302H1/ STA302H5/ STAC67H3
- Multivariate calculus: MAT235Y1 / MAT237Y1 / MAT257Y1 / (MATB41H3, MATB42H3) / (MAT232H5, MAT236H5) / (MAT233H5, MAT236H5)
- Linear algebra: MAT223H1 / MAT240H1 / MATA22H3 / MATA23H3 / MAT223H5 / MAT240H5
- Programming basics: CSC108H1 / CSC110Y1 / CSC120H1 / CSC148H1 / CSCA08H3 / CSCA48H3 / CSCA20H3 / CSC108H5 / CSC148H5

Instructor

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Course Materials and Important Links

Course email Please, *do not* email the instructor or TAs on their personal or professional emails, unless for absolute emergency. Instead, use the course email, sta314@course.utoronto.ca, for special requests, such as: homework extension, regrading request, absence due to illness, etc. Questions about course material will not be addressed over email and these questions should be instead directed to the course Piazza site.

Course Website All the course materials (schedule, lecture and tutorial slides, readings, practical problem sets) can be found on the course website http://courses.utstat.utoronto.ca/sta314_f24/.

Quercus & Piazza Quercus will only be used to make annoucements. We will use Piazza for the course forum to which you need to sign up via https://piazza.com/utoronto.ca/fall2024/sta314. If your question is about the course material, logistics and clarification on homework & tutorial problems, please post to Piazza so that the entire class can benefit from the answer. All questions that give hint on *solving* homeworks should be exclusively asked during office hours.

Textbooks We will mainly use the following textbook for the course.

• Gareth James, Daniela Witten, Trevor Hastie, and Robert Tibshirani. An Introduction to Statistical Learning. https://www.statlearning.com.

Students are only responsible for the material covered in lectures, tutorials, and homeworks. There are many other publicly available references that you may find useful, such as

- Trevor Hastie, Robert Tibshirani, and Jerome Friedman. The Elements of Statistical Learning.
- Chris Bishop. Pattern Recognition and Machine Learning.
- Kevin Murphy. Machine Learning: a Probabilistic Perspective.

Delivery Details

Unless otherwise specified, lectures and tutorials will be held in-person. There will be *no* synchronous online video stream or recordings of the lectures. Students should be enrolled in a lecture section and a tutorial section. The tutorial sessions are complementary to the lectures, and provide reviews and extension of the important concepts / methods in the lectures as well as helpful demonstrations on how to use computational software to conduct statistical analysis. Students are highly encouraged and expected to attend both lectures and tutorials.

| Section | Category | Time | Location |
|---------|--|--|----------------------------|
| LEC0101 | Lectures | Mon $(10 \text{am-}11 \text{am})$, Wed $(11 \text{am-}1 \text{pm})$ | MP103 |
| | Instructor's Office Hours | Mon (2pm-3pm) | Zoom |
| | Tutorials $(101-104)$ | Mon $(11am-12pm)$ | See ACORN |
| LEC0201 | Lectures Instructor's Office Hours Tutorials (201–204) | Mon (3pm-4pm), Wed (3pm-5pm) Mon (3pm-4pm) Mon (4pm-5pm) | BR200 Zoom See ACORN |

The first lecture will be on Wednesday, September 4th. We will deliver lectures on every Wednesday whereas the lectures on Mondays (10-11am, 3-4pm) will be scheduled case by case. For instance, we will skip some Mondays in November. You should frequently check the course website for the schedule of lectures ahead.

The scheduled office hours and tutorial sessions of the TA's are listed below. Students are highly encouraged to choose the TA's office hours corresponding to their registered tutorial sessions. Unless necessary, do not attend sessions or use office hours for the other section.

| Section | TA | Office Hour | Location |
|---------|-----------------------------------|-------------------------------------|-----------|
| LEC0101 | Haochen Song | Tue (5pm-6pm) | zoom |
| | Xiaochuan Shi | Mon $(5pm-6pm)$ | zoom |
| | Jorge Arturo Esquivel Fuente | Tue $(11 \text{am} - 12 \text{am})$ | zoom |
| | Junhao Zhu | Fri (9am-10am) | in-person |
| LEC0201 | Liam Welsh | Thu (9am-10am) | zoom |
| | Luis Sierra Muntané | Tue (10am-11am) | in-person |
| | Konstantinos Christopher Tsiolis | Thu (4pm-5pm) | zoom |
| | Rafael Alexander Valencia Sanchez | Thu (12:30pm-1:30pm) | zoom |

Course Grading Scheme

Students are evaluated based on quizzes, tests and course project.

| Item | Credit |
|---|--------|
| Quizzes (taken during tutorials) | 5% |
| Midterm One (held during class) | 25% |
| Midterm Two (held during class) | 25% |
| Final Test (held during the final period) | 25% |
| Course Project (throughout the semester) | 20% |

Students who frequently answer questions on Piazza or actively participate in discussions during lectures will be given an extra 2-3% credits.

Tests

The course will have 3 mandatory tests, each with a duration of 2 hours. The two midterm tests are held during the normal class time while the final test is held in the final assessment period (see the dates and locations below). For both midterm tests, students must take the test with their assigned section. All tests will be closed-book. Students are responsible for the material covered in lectures, tutorials, and practical sets. More details on the tests will be provided during the term.

| | LEC0101 | | LEC0201 | |
|--|---|------------------|---|------------------|
| Midterm One Midterm Two Final Test | Sep 25th, 11am-1pm Oct 23th, 11am-1pm TBA | EX 100 EX 200 | Sep 25th, 3pm-5pm Oct 23th, 3pm-5pm TBA | EX 100 EX 100 |

Missed tests For any midterm test you missed, its grading weight will be equally added up to the other exams that <u>have not</u> been taken, meaning that

- If you missed the first midterm, both the second midterm and the final exam will be worth 37.5% per each. If you further missed the second midterm, the final will be worth 75%.
- If you took the first midterm but missed the second midterm, your first midterm will still be worth 25% but your final will be worth 50%.

Collaboration policy Collaboration on the tests is *strictly* not allowed, and you *must not* discuss the test with anyone other than the instructor or TAs. Each student is responsible for his/her own work. Violation of this policy is an academic offence and will be investigated and reported as such.

Regrading policy Regrading requests should be submitted to the course email sta314@course.utoronto.ca. Regrading requests must include student name, student number, and a justification for the request, which refers specifically to the problem and the student's answers. Requests without this justification will not be considered. Requests will be considered by the same TA who marked the problem. The deadline for requesting a regrading is one week after the marks are returned. Regrading requests may result in a decrease in the grade.

Academic Integrity

The University supports acting in honesty, trust, fairness, respect, responsibility, and courage in all academic matters. Students are responsible for knowing the content of the Universitys Code of Behaviour on Academic Matters. All suspected cases of academic dishonesty will be investigated following procedures outlined in the Code of Behaviour above. If you have questions or concerns about what constitutes appropriate academic behaviour or appropriate research and citation methods, you are expected to seek out additional information on academic integrity from your instructor or from other institutional resources (http://academicintegrity.utoronto.ca/).

Course Project

A course project will be initiated within the first two weeks and span the whole fall semester. The goal of the course project is to provide real world applications in which students shall use statistical methods, not only the ones learned in this course but also the ones beyond the course material, to solve practical problems.

Students are encouraged to form groups of size 1 to 4 to finish the course project. Your final score will not depend on group size. The final delivery of the project should be one written report from each group. More details of the course project will be announced separately later.

Practical Problem Sets

There will be (tentatively) 4 sets of practical problems in this course which will be released on the course webpage during this semester. The problem sets do not count into your final grades but will be very helpful to strengthen and deepen your understanding of the content in both lectures and tutorials. They could also be related to the exam questions. Students are highly encouraged to carefully go over the problem sets and should be able to solve all questions. Solution to each practical set will be posted at the same time.

The following table contains tentative dates of releasing each practical problem set as well as its solution.

| Item | Release |
|---------------|---------|
| Problem Set 1 | Sep 9 |
| Problem Set 2 | Sep 16 |
| Problem Set 3 | Oct 7 |
| Problem Set 4 | Nov 6 |