

| MODULE TITLE MODULE CODE         | Bayesian statistics, Philosophy and<br>Practice<br>MTH3041 |    | CREDIT VALUE MODULE CONVENER |   | 15<br>Prof Daniel Williamson<br>(Coordinator) |
|----------------------------------|--|----|------------------------------|---|---|
| <b>DURATION: TERM</b>            | 1  | 2  |                              | 3 |   |
| <b>DURATION: WEEKS</b>           | 11   | 0  |                              | 0 |   |
| <b>Number of Students Taking</b> | g Module (anticipated)                                     | 25 |                              |   |   |

#### **DESCRIPTION** - summary of the module content

Since the 1980s, computational advances and novel algorithms have seen Bayesian methods explode in popularity, today underpinning modern techniques in data analytics, pattern recognition and machine learning as well as numerous inferential procedures used across science, social science and the humanities.

This module will introduce Bayesian statistical inference, describing the differences between it and classical approaches to statistics. It will develop the ideas of subjective probability theory for decision-making and explore the place subjectivity has in scientific reasoning. It will develop Bayesian methods for data analysis and introduce modern Bayesian simulation based techniques for inference. As well as underpinning a philosophical understanding of Bayesian reasoning with theory, we will use software currently used for Bayesian inference in the lab, allowing you to apply techniques discussed in the course to real data.

Pre-requisite: MTH2006 Statistical Modelling and Inference or equivalent

#### AIMS - intentions of the module

This module will cover the Bayesian approach to modelling, data analysis and statistical inference. The module describes the underpinning philosophies behind the Bayesian approach, looking at subjective probability theory, subjectivity in science as well as the notion and handling of prior knowledge, and the theory of decision making under uncertainty. We then move to Bayesian modelling and inference looking at parameter estimation in simple models and then hierarchical models. Finally, we explore simulation-based inference in Bayesian analyses and develop important algorithms for Bayesian simulation by Markov Chain Monte Carlo (MCMC) such the Gibbs sampler and the Metropolis-Hastings algorithm. This module is an excellent precursor to MTH3012.

#### INTENDED LEARNING OUTCOMES (ILOs) (see assessment section below for how ILOs will be assessed)

On successful completion of this module you should be able to:

#### **Module Specific Skills and Knowledge**

- 1. Show understanding of the subjective approach to probabilistic reasoning;
- 2. Demonstrate an awareness of Bayesian approaches to statistical modelling and inference and an ability to apply them in practice;
- 3. Demonstrate understanding of the value of simulation-based inference and knowledge of techniques such as MCMC and the theories underpinning them;
- 4. Demonstrate the ability to apply statistical inference in decision-making;
- 5. Utilise appropriate software and a suitable computer language for Bayesian modelling and inference from data.

## Discipline Specific Skills and Knowledge

6. Demonstrate understanding, appreciation of and aptitude in the quantification of uncertainty using advanced mathematical modelling;

### Personal and Key Transferable / Employment Skills and Knowledge

- 7. Show advanced Bayesian data analysis skills and be able to communicate associated reasoning and interpretations effectively in writing;
- 8. Apply relevant computer software competently;
- 9. Use learning resources appropriately;
- 10. Exemplify self-management and time-management skills.

#### SYLLABUS PLAN - summary of the structure and academic content of the module

Introduction: Bayesian vs Classical statistics, Nature of probability and uncertainty, Subjectivism.

**Decision Theory:** Bayes' rule, Bayes' risk, Decision trees, Sequential Decision making, Utility.

**Bayesian inference:** Conjugate models, Prior and Posterior predictive distributions, Posterior summaries and simulation, Objective and subjective priors, Nuisance parameters, Hierarchical models, Bayesian regression.

Bayesian Computation: Monte Carlo, Inverse CDF, Rejection Sampling, Markov Chain Monte Carlo (MCMC), The Gibbs sampler, Metropolis Hastings, Diagnostics.

#### **LEARNING AND TEACHING** LEARNING ACTIVITIES AND TEACHING METHODS (given in hours of study time) **Scheduled Learning & Teaching Activities** 33.00 Guided Independent Study 0.00 117.00 Placement / Study Abroad **DETAILS OF LEARNING ACTIVITIES AND TEACHING METHODS** Category Hours of study time Description Scheduled learning and teaching activities 33 Lectures/practical classes Guided independent study 33 Post-lecture study and reading 40 Guided independent study Formative and summative coursework preparation and attempting un-assessed problems Guided independent study 44 Exam revision/preparation

# **ASSESSMENT**

| Form of Assessment                               | Size of Assessment (e.g. duration/length) | ILOs<br>Assessed | Feedback Method  |
|--|---|------------------|--|
| Coursework - practical and theoretical exercises | 15 hours                                  | All              | Verbal in class, written feedback on script and oral feedback in office hour |

| SUMMATIVE ASSESSMENT (% of credit)   |         |    |                  |   |                |                           |   |  |
|--|---------|----|------------------|---|----------------|---------------------------|---|--|
| Coursework 20 Written Exams  |         |    | 80               | Practical I                               | ractical Exams |                           |   |  |
| DETAILS OF SUMMATIVE ASSESSMENT  |         |    |                  |   |                |                           |   |  |
| Form of Assessment   |         |    | % of Credit      | Size of Assessment (e.g. duration/length) |                | ILOs<br>Assessed          | Feedback Method   |  |
| Written exam – Restricted Note. 1 Sheet of A4 (two sides) handwritten or typed notes |         | 80 | 2 hours (Summer) |   | 1-8, 9, 10     | Written/verbal on request |   |  |
| Coursework - practical and theoretical ex-   | ercises |    | 20               | 15 hours                                  |                | All                       | Written feedback on script and oral feedback in office hour |  |

|                                      | S OF RE-ASSESSMENT (where required by referral or deferral) |                  |                              |  |  |  |
|--------------------------------------|---|------------------|------------------------------|--|--|--|
| Original Form of Assessment Fo       | orm of Re-assessment  | ILOs Re-assessed | Time Scale for Re-assessment |  |  |  |
| Written exam * Wr                    | ritten Exam (2 hours) 1                                     | 1-7, 9, 10       | August Ref/Def Period        |  |  |  |
| Coursework * Coursework Coursework * | oursework A   | All A            | August Ref/Def Period        |  |  |  |

<sup>\*</sup>Please refer to reassessment notes for details on deferral vs. Referral reassessment

### **RE-ASSESSMENT NOTES**

Deferrals: Reassessment will be by coursework and/or written exam in the deferred element only. For deferred candidates, the module mark will be uncapped. Referrals: Reassessment will be by a single written exam worth 100% of the module only. As it is a referral, the mark will be capped at 40%.

# **RESOURCES**

INDICATIVE LEARNING RESOURCES - The following list is offered as an indication of the type & level of information that you are expected to consult. Further guidance will be provided by the Module Convener

Basic reading:

ELE: http://vle.exeter.ac.uk/

Web based and Electronic Resources:

Undley, D. V. "Making Decisions"
De Groot, M. H. "Optimal Statistical Decisions".
Sivia, D. S. "Data Analysis, A Bayesian Tutorial".
Reading list for this module:

| Туре   | Author        | Title      |                      | Editi | on       | Publisher    | Year       | ISBN                    | Search    |
|--|---------------|------------|----------------------|-------|----------|--------------|------------|-------------------------|-----------|
| Set  | A Gelman      | Bayesian D | Oata Analysis        | 3rd   |          | CRC Press    | 2013       | 9781439840955           | [Library] |
| CREDIT   | VALUE         |            | 15                   |       | ECTS VA  | ALUE         |            | 7.5                     |           |
| PRE-REQUISITE MODULES  |               |            | MTH2006              |       |          |              |            |                         |           |
| CO-REQ   | UISITE MODULE | S          |                      |       |          |              |            |                         |           |
| NQF LEVEL (FHEQ) 6   |               |            | 6                    | 4     | AVAILABL | E AS DISTANC | E LEARNING | No                      |           |
| ORIGIN   | DATE          |            | Tuesday 10 July 2018 | 1     | LAST REV | ISION DATE   |            | Wednesday 15 February 2 | 023       |
| <b>KEY WORDS SEARCH</b> Bayesian; Bayes; Statistics; Data, Big Data; Analysis; Decision Theory; Inference; Mathematics; Probability. |               |            |                      |       |          |              |            |                         |           |