# MATH 559 Bayesian Theory and Methods

Instructor: David A. Stephens (Burnside 1225)

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Texts: The Bayesian Choice, CP Robert.

Bayesian Core: A Practical Approach to Computational Bayesian Statistics,

J-M Marin and CP Robert.

Bayesian Theory, J.M. Bernardo and AFM Smith

Monte Carlo Statistical Methods, CP Robert and G Casella.

Prerequisites: MATH 323/356, MATH 324/357, or equivalents, or by permission of instructor.

Good knowledge of calculation methods for probability distributions

Familiarity with classical statistical methods, especially likelihood-based methods

Knowledge of regression approaches useful.

Experience in R or python useful.

This course provides an introduction to Bayesian inference and key Bayesian methods. Contrast will be made with the frequentist or classical approaches to statistics. Core theoretical ideas will be introduced from first principles stemming from de Finetti's representation for exchangeable random variables. Inference for standard parametric models will be introduced, and extended to hierarchical and more complex models. Simulation-based inference will be introduced, specifically computational strategies based on Monte Carlo methods. The course will contain an introduction to Markov chain Monte Carlo with implementation in R, Stan or python. An introduction to Bayesian nonparametric methods.

#### TARGET SYLLABUS

**Topics to be covered include:** Recap of frequentist statistical theory; subjective probability, Bayesian statistical inference and decision making; de Finetti's representation; parametric methods; optimal decisions; conjugate models; methods of prior specification and elicitation; approximation methods; hierarchical models; computational approaches to inference; Markov chain Monte Carlo methods; Metropolis—Hastings; nonparametric Bayesian inference.

#### METHOD OF EVALUATION

- Five assignments, best four to count (4 × 10 = 40 %)
   Assignments will be a mix of theory calculations and computational work.
   Assignments will be set roughly every two weeks from the end of the Add/Drop period.
   Penalty for late submission may be up to 100%.
- Final exam (60 %)

Final exam will be a regular final exam held during the University examination period.

The examination timetable is set by the Examinations Office and is not in the control of the Instructor. You are advised not to make travel arrangements until the date of the final exam is confirmed.

In the event of extraordinary circumstances beyond the University's control, the content and/or evaluation scheme in this course is subject to change. If you need special assessment arrangements or accommodations, please contact *Student Accessibility and Achievement* 

Student Accessibility and Achievement.

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Approved by Senate on 21 January 2009

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# Code of Student Conduct and Disciplinary Procedures

Approved by Senate on 29 January 2003

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David A. Stephens Department of Mathematics and Statistics August 30, 2023