# Prepare to Teach

Breakout Session: Teaching Bayesian Statistics

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## A Bayesian module vs a Bayesian course

- Bayesian modules
  - Introductory courses
  - Intermediate / advanced courses
  - Link to a USCOTS workshop material: <u>bit.ly/USCOTS2021 Bayes HuRoss material</u>

- Bayesian courses
  - Introduction to statistics with a Bayesian flavor
    - <u>Kevin Ross's notes for Cal Poly STAT 415</u> (work in progress!)
  - Intermediate / advanced courses with calculus, probability and statistics pre-reqs
    - Monika Hu's github repo of Vassar MATH 347
    - Links to material of other courses (undergrad / masters)

# Sample course schedules: 10-week vs 14-week

Area	Topic	10-week	14-week
Foundation of Bayesian Inference	Beta-binomial	1	1
	Normal-normal	-	2
	Conjugacy	2	3
	Prediction	3	4
Bayesian computing	MCMC	4	5
	Gibbs sampler	5	6
	Metropolis-Hastings	6	7
	MCMC diagnostics	7	8
Bayesian modeling	Linear regression	8	9
	Hierarchical mods	9	10
	Logistic regression	10	11
	GLM	v.	12
Additional topics	Model checking, comparison, selection	-	13
	Missing data imputation, more on priors	-	14

Dogucu and Hu (in preparation)

# Bayesian computing

- Simulation-based teaching and learning (Albert and Hu, 2020)
- MCMC estimation (Hu and Dogucu, submitted)

Method	Suitable for
Self-coded MCMC algorithms	- Intermediate / advanced course
JAGS, Stan, BUGS	<ul> <li>Intermediate / advanced module</li> <li>Introductory course</li> <li>Intermediate / advanced course</li> </ul>
Stan-based wrapper functions, e.g., rstanarm, brms	<ul><li>Intermediate / advanced module</li><li>Intermediate / advanced course</li></ul>

## Recommendations and tips

- Real world applications
- Student-centered learning (Hu, 2020)
  - Projects
  - Case studies
  - Journal articles reading and discussion
- Make a deliberate choice of Bayesian computing
- Comparisons to Frequentist methods?
  - Totally up to you!

#### Resources

- List of textbooks (some are free online), papers, courses (with slides)
  - <u>Undergraduate Bayesian Education Resources</u>
  - <u>Undergraduate Bayesian Resources</u>
- Undergraduate Bayesian Education Network (Slack)
- <u>Education Research and Practice Section</u> (International Society for Bayesian Analysis)
- Recent workshops and webinars and papers (2020 ~)
  - Introducing Bayesian Statistical Analysis into Your Teaching (USCOTS 2021)
  - <u>Teaching Bayesian Statistics at the Undergraduate Level</u> (USCOTS 2021)
  - Bayesian Methods and the Statistics and Data Science Curriculum (CAUSE & JSDSE webinar series, 2021)
  - <u>Bayes cluster</u> @ Journal of Statistics Education, 2020

#### Discussion questions

- What plans do you have to incorporate Bayesian methods in your teaching?
  - a. A module? At what level?
  - b. A course? At what level?
  - c. Who might be your students? What kind of preparation they might have?

- Have you considered what Bayesian computing approaches to use in your teaching?
  - d. Self-coded MCMC algorithms?
  - e. JAGS, Stan, BUGS?
  - f. Stan-based wrapper functions, e.g., rstanarm, brms

# Discussion questions cont'd

- What kind of challenges do you foresee when teaching Bayesian methods?

What resources for teaching and learning Bayesian ideas are you familiar with? Please share!

What resources do you wish were available?

#### References

Albert, J. and Hu, J. (2020), Bayesian computing in the undergraduate statistics curriculum, *Journal of Statistics Education*, 28(3), 236-247.

Dogucu, M. and Hu, J., The current state of undergraduate Bayesian education and recommendations for the future, in preparation.

Hu, J. (2020), A Bayesian statistics course for undergraduates: Bayesian thinking, computing, and research, *Journal of Statistics Education*, 28(3), 229-235.

Hu, J. and Dogucu, M., Content and computing outline of two undergraduate Bayesian courses: tools, examples, and recommendations, submitted.