

# HOMEWORK 1. DUE, IN CLASS, WED JAN 13

1. WE USE THE "BETA-GAMMA CALCULUS" SO OFTEN, WE'D LIKE TO MAKE SURE YOU KNOW HOW IT WORKS. THE GAMMA DENSITY ON  $(0, \infty)$  IS  $e^{-x} x^{a-1} / \Gamma(a)$  FOR  $a > 0$ , A FIXED PARAMETER. THE BETA DENSITY ON  $(0, 1)$  IS  $\frac{\Gamma(a+b)}{\Gamma(a)\Gamma(b)} x^{a-1} (1-x)^{b-1}$  FOR  $a, b > 0$ . LET  $X, Y, Z$  BE INDEPENDENT RANDOM VARIABLES HAVING GAMMA DENSITIES WITH RESPECTIVE PARAMETERS  $\alpha, \beta, \gamma$ . SHOW THAT  $X/(X+Y)$ ,  $X+Y/(X+Y+Z)$  AND  $X+Y+Z$  ARE INDEPENDENT  $\beta(\alpha, \beta)$ ,  $\beta(\alpha+\beta, \gamma)$ ,  $\text{Gamma}(\alpha+\beta+\gamma)$  DISTRIBUTED. CAN YOU GIVE A CONCEPTUAL REASON FOR THE INDEPENDENCE?

2. AN URN CONTAINS ONE RED, ONE WHITE AND ONE BLUE BALL. EACH TIME, A BALL IS CHOSEN AT RANDOM (UNIFORMLY) FROM THE URN AND REPLACED, TOGETHER WITH A NEW BALL OF THE SAME COLOR. LET  $X_1, X_2, X_3, \dots$  DENOTE THE COLORS DRAWN ON TRIALS  $1, 2, 3, \dots$ . CONSIDER ANOTHER PROCESS TAKING VALUES IN  $\{R, W, B\}$ : PICK  $(p_1, p_2, p_3) \geq 0, p_1+p_2+p_3=1$  FROM THE UNIFORM DISTRIBUTION ON THE SIMPLEX. FIX THIS AND DRAW REPEATEDLY AND INDEPENDENTLY FROM THIS DISTRIBUTION REPORTING R, W, OR B AS YOU DRAW  $1, 2$  OR  $3$ . LET  $Y_1, Y_2, Y_3, \dots$  BE THE RESULTING PROCESS. PROVE THAT, FOR ANY  $n$

$$P(Y_1=y_1, Y_2=y_2, \dots, Y_n=y_n) = P(X_1=y_1, X_2=y_2, \dots, X_n=y_n).$$

3. LET  $\alpha_1, \alpha_2, \alpha_3, \dots$  BE POSITIVE NUMBERS WITH  $A = \sum_{i=1}^{\infty} \alpha_i < \infty$ . LET  $Z_i$  BE INDEPENDENT RANDOM VARIABLES WITH PARAMETERS  $\alpha_i$ . SHOW THAT  $S = \sum_{i=1}^{\infty} Z_i$  IS FINITE ALMOST SURELY. DEFINE A RANDOM PROBABILITY  $Y = (Y_1, Y_2, \dots)$  BY  $Y_i = Z_i/S$ . THE JOINT LAW OF THE  $Y_i$  IS CALLED  $D_\alpha$  (DIRICHLET  $(\alpha)$ ). HERE IS ANOTHER CONSTRUCTION:

LET  $W_1 \sim \text{Beta}(\alpha_1, A-\alpha_1)$ ,  $W_2 \sim \text{Beta}(\alpha_2, A-\alpha_1-\alpha_2)$ ,  $W_3 \sim \text{Beta}(\alpha_3, A-\alpha_1-\alpha_2-\alpha_3), \dots$  ALL INDEPENDENT. FORM AN INFINITE 'RANDOM PROBABILITY' BY 'STICK BREAKING'

$P_0 = W_1, P_1 = W_2(1-P_0), P_2 = W_3(1-P_0-P_1), \dots$   
SHOW THAT  $P = (P_0, P_1, P_2, \dots)$  HAS A  $D_\alpha$  DISTRIBUTION.

## NOTES ON BAYESIAN BOOKS.

THERE ARE NOW MANY REASONABLE BAYESIAN BOOKS; I PUT ONE OF THEM WHICH SEEMS CURRENT & GOOD ON RESERVE FOR STATISTICS 370

1. JEFF GILL (2008) BAYESIAN METHODS CHAPMAN AND HALL. THIS HAS A SOCIAL SCIENCE PERSPECTIVE BUT HAS GOOD COVERAGE OF MATH AND COMPUTING BACKGROUND
2. A USEFUL BOOK WHICH YOU CAN DOWN-LOAD FROM THE WEB IS E.T. JAYNES (1995) PROBABILITY THEORY: THE LOGIC OF SCIENCE; <http://omega.albany.edu:8008/JAYNESBOOK.html>. THIS WAS MY FIRST INTRODUCTION TO BAYES; ITS VERY DOWN TO EARTH AND WORTH WHILE. SEE ALSO, DAVID MACKAY (2003). INFORMATION THEORY, INFERENCE AND LEARNING ALGORITHMS.
- 3,4 THE 'STANDARD' MODERN BOOKS ARE, BERGER, J. (1985). STATISTICAL DECISION THEORY AND BAYESIAN ANALYSIS 2<sup>nd</sup> ED. SPRINGER; AND BERNARDO, J. AND SMITH, A. (1994). BAYESIAN THEORY
- 5,6. TWO CLASSICS; JEFFREYS, H. (1961). THEORY OF PROBABILITY 3<sup>rd</sup> ED. OXFORD AND LINDLEY, D.V. (1965). INTRODUCTION TO PROBABILITY AND STATISTICS FROM A BAYESIAN VIEWPOINT CAMBRIDGE. (THE FIRST COURSE I EVER TAUGHT WAS OUT OF LINDLEY, ITS STILL GOOD AND JEFFREYS BOOK IS GREAT)
- 7,8. TWO MODERN BOOKS: GELMAN, A, CALLIN, B, STEIN, H. AND RUBIN D. (1998). BAYESIAN DATA ANALYSIS CHAPMAN HILL, LEONARD, T. AND HSH, J. (1999). BAYESIAN METHODS OXFORD. BOTH ARE FULL OF PRACTICAL EXAMPLES IN REAL PROBLEMS.
9. A VERY GOOD BOOK ON MONTE-CARLO METHODS FOR BAYESIAN ANALYSIS IS chen, H. SHAO, Q, IBERHIM J. (2000). MONTE CARLO METHODS IN BAYESIAN COMPUTATION SPRINGER;

BR279.5.

OUR LIBRARY HAS A BAYESIAN SECTION, SEE IN PARTICULAR THE SERIES 'STUDIES IN BAYESIAN APPLICATION SERIES R. KASS ED. ALSO, THE SERIES OF CONFERENCE PROCEEDINGS BAYESIAN STATISTICS I - VII ED BY JOSE BERNARDO ET AL, FOR MANY APPLICATIONS & CURRENT RESEARCH  
MORE COMING!