## Problem Set 7

ECON 6343: Econometrics III Prof. Tyler Ransom University of Oklahoma

Due: October 18, 9:00 AM

Directions: Answer all questions. Each student must turn in their own copy, but you may work in groups. Clearly label all answers. Show all of your code. Turn in jl-file(s), output files and writeup via GitHub. Your writeup may simply consist of comments in jl-file(s). If applicable, put the names of all group members at the top of your writeup or jl-file.

You may need to install and load the following package:

 $\mathtt{SMM}$ 

You will need to load the following previously installed packages:

Optim

HTTP

GLM

LinearAlgebra

Random

Statistics

DataFrames

DataFramesMeta

CSV

In this problem set, we will practice estimating models by Generalized Method of Moments (GMM) and Simulated Method of Moments (SMM).

- 1. Estimate the linear regression model from Question 2 of Problem Set 2 by GMM. Write down the moment function as in slide #8 of the Lecture 9 slide deck and use Optim for estimation. Use the  $N \times N$  Identity matrix as your weighting matrix. Check your answer using the closed-form matrix formula for the OLS estimator.
- 2. Estimate the multinomial logit model from Question 5 of Problem Set 2 by the following means:
  - (a) Maximum likelihood (i.e. re-run your code [or mine] from Question 5 of Problem Set 2)
  - (b) GMM with the MLE estimates as starting values. Your g object should be a vector of dimension  $N \times J$  where N is the number of rows of the X matrix and J is the dimension of the choice set. Each element, g should equal d-P, where d and P are "stacked" vectors of dimension  $N \times J$
  - (c) GMM with random starting values

Compare your estimates from part (b) and (c). Is the objective function globally concave?

- 3. Simulate a data set from a multinomial logit model, and then estimate its parameter values and verify that the estimates are close to the parameter values you set. That is, for a given sample size N, choice set dimension J and parameter vector  $\beta$ , write a function that outputs data X and Y. I will let you choose N, J,  $\beta$  and the number of covariates in X (K), but J should be larger than 2 and K should be larger than 1. If you haven't done this before, you may want to follow these steps:
  - (a) Generate X using a random number generator—rand() or randn().
  - (b) Set values for  $\beta$  such that conformability with X and J is satisfied
  - (c) Generate the  $N \times J$  matrix of choice probabilities P
  - (d) Draw the preference shocks  $\varepsilon$  as a  $N \times 1$  vector of U[0,1] random numbers
  - (e) Generate *Y* as follows:
    - Initialize Y as an  $N \times 1$  vector of 0s
    - Update  $Y_i = \sum_{j=1}^{J} 1 \left[ \left\{ \sum_{k=j}^{J} P_{ik} \right\} > \varepsilon_i \right]$
  - (f) An alternative way to generate choices would be to draw a  $N \times J$  matrix of  $\varepsilon$ 's from a T1EV distribution. This distribution is already defined in the Distributions package. Then  $Y_i = \arg\max_j X_i \beta_j + \varepsilon_{ij}$ . I'll show you an example of how to do that in the solutions code for this problem set.
- 4. Use SMM. jl to run the example code on slide #21 of the Lecture 9 slide deck.
- 5. Use your code from Question 3 to estimate the multinomial logit model from Question 2 using SMM and the code example from slide #18 of the Lecture 9 slide deck.