# Homework #5

# Carlos Rangel

```
% Add CompEcon toolbox to path addpath(genpath('../compecon2011'))

% Load Homework Data load hw5.mat

% Store Data global X; global Y; global Z;

X = data.X'; Y = data.Y'; Z = data.Z';
```

# Question 1.

Assume  $u_i = 0$  for all i. (i.e. take  $u_i$  out of the model, so that  $u_0 = \sigma_u = \sigma_{u\beta} = 0$ ). Use Guassian Quadrature using 20 nodes to calculate the log-likelihood function when  $\beta_0 = 0.1, \sigma_\beta = 1$ , and  $\gamma = 0$ .

```
% Number of Nodes to Use
global n_nodes;
n_nodes = 20;

% Compute log-likelihood using Gaussian Quadrature
gq_loglike([0 0.1 1])

ans = -1.2571e+03
```

#### Question 2

Now use Monte Carlo Methods using 100 nodes to calculate the log-likelihood function.

```
n_nodes = 100;

% Compute the log-likelihood using Monte-Carlo (Fix ... Seed at 1).
```

```
mc = log like 1 ([0 \ 0.1 \ 1], 1)
```

```
ans = -1.2602e + 03
```

# Question 3.

Maximize (or minimize the negative) log-likelihood function with respect to the parameters using both integration techniques above. Use Matlab's fmincon without a supplied derivative to max (min) your objective function.

Using First Integration Technique

```
\% Initial Guess x0 = 0.5*ones(1,3)
```

```
x0 = 1x3
0.5000
0.5000
0.5000
```

```
% Define Negative of Loglikelihood
neg_gqloglike=@(x) -gq_loglike(x);

% Lower Bounds
lb = [-Inf; -Inf; eps];

% Upper Bounds
ub = [Inf; Inf; Inf];

% Maximization
[gq_argmax, gq_maxval] = fmincon(neg_gqloglike, ...
x0, [], [], [], lb, ub);
```

Local minimum possible. Constraints satisfied.

fmincon stopped because the size of the current step is less than the default value of the step size tolerance and constraints are satisfied to within the default value of the constraint tolerance.

< stopping criteria details >

```
% Argmax
% First element corresponds to gamma
% Second Element corresponds to beta _ 0
% Third element corresponds to variance of beta
```

```
gq \mathrel{\_} argmax
```

```
gq = argmax = 1x3
-0.5060 2.4937 1.3738
```

```
% Maximized Value gq _ maxval
```

```
gq \_ maxval = 536.7241
```

Using Second Integration Technique

```
% Initial Guess x0 = 0.5*ones(1,3)
```

```
    \begin{array}{rcl}
        & x0 & = & 1x3 \\
        & 0.5000 & 0.5000 & 0.5000
    \end{array}
```

```
% Define Negative of Log-Likelihood (Fix Seed at 1)
neg _ mcloglike = @(x) -mc _ loglike1(x,1);

% Lower Bounds
lb = [-Inf; -Inf; eps];

% Upper Bounds
ub = [Inf; Inf; Inf];

% Maximization
[mc _ argmax, mc _ maxval] = fmincon(neg _ mcloglike, ...
x0, [], [], [], lb, ub);
```

Local minimum possible. Constraints satisfied.

fmincon stopped because the size of the current step is less than the default value of the step size tolerance and constraints are satisfied to within the default value of the constraint tolerance.

< stopping criteria details >

```
% Argmax
% First element corresponds to gamma
% Second Element corresponds to beta _ 0
```

% Third element corresponds to variance of beta  $mc\_\,argmax$ 

```
mc\_argmax = 1x3 
 -0.5053   2.5524   1.1551
```

```
% Maximized Value mc_maxval
```

```
mc maxval = 535.9903
```

### Question 4

```
% Initial Guess
x0 = [0,2,1.5,5,0.5,10]
```

```
x0 = 1x6
0 = 2.0000
1.5000
5.0000
0.5000
```

```
% Lower Bounds
lb = [-Inf; -Inf; -Inf; eps; -Inf; eps];

% Upper Bounds
ub = [Inf; Inf; Inf; Inf; Inf];

% Define Negative of Log Likelihood (Fix Seed at 1)
neg _ full _ mcloglike = @(x) - full _ mcloglike(x,1);

% Maximization
[full _ argmax, ...
    full _ maxval] = fmincon(neg _ full _ mcloglike, x0, ...
[], [], [], [], lb, ub);
```

Local minimum possible. Constraints satisfied.

fmincon stopped because the size of the current step is less than the default value of the step size tolerance and constraints are satisfied to within the default value of the constraint tolerance.

< stopping criteria details >

```
% Argmax
% First element corresponds to gamma
\% Second Element corresponds to beta \_\,0
\% Third element corresponds to u_0
\% Fourth element corresponds to element (1,1) of ...
   the Cholesky matrix of sigma2 matrix
\% Fifth element corresponds to element (2\,{,}1) of the \dots
   Cholesky matrix
\% Sixth element corresponds to element (2\,,2) of the \dots
   Cholesky matrix
full _ argmax(1:3)
ans = 1x3
   -0.6832
               3.1612
                          1.3677
\% Maximized value
full maxval
full \_maxval = 463.8203
% Variance - Covariance Matrix
% Cholesky Matrix
R = [full \_argmax(4) \ 0; \ full \_argmax(5) \dots]
   full _ argmax(6)];
% Variance-Covariance Matrix
sigma = R*R'
sigma = 2x2
    1.6484
               0.7016
    0.7016
               1.7956
```