

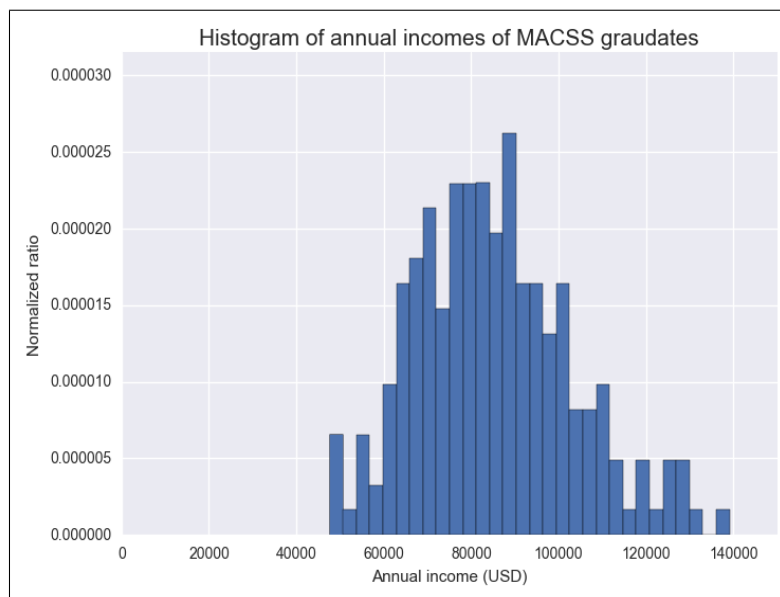
Problem Set #3

MACS 30100, Dr. Evans

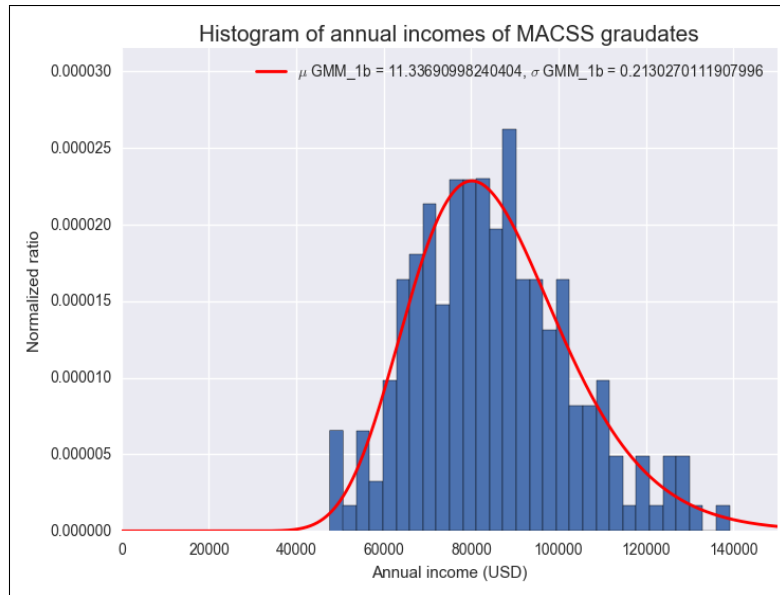
Bobae Kang

1. Some income data, lognormal distribution, and GMM.

- (a) Plot a histogram of percentages of the ‘income.txt’ data with 30 bins. Make sure that the bins are weighted using the ‘normed=True’ option. Make sure your plot has correct x-axis and y-axis labels as well as a plot title.



- (b) Estimate the parameters of the lognormal distribution by generalized method of moments. Plot your estimated lognormal PDF against the histogram from part (a). Report the value of your GMM criterion function at the estimated parameter values. Report and compare your two data moments against your two model moments at the estimated parameter values.



GMM criterion function value = $3.93982160 \times 10^{-13}$

GMM estimate for $\mu = 11.3369099824$

GMM estimate for $\sigma = 0.213027011191$

Data moments:

Mean = 85276.8236063

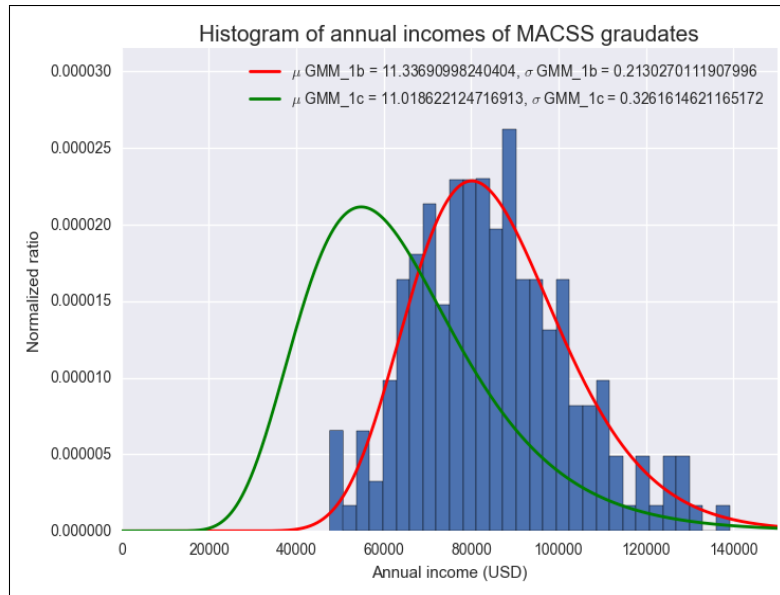
Standard Deviation = 17992.542128

Model moments:

Mean = 85276.79520510265

Standard Deviation = 17992.5325554

- (c) Perform the two-step GMM estimator by using your estimates from part (b) with two moments to generate an estimator for the variance covariance matrix. Report your estimates as well as the criterion function value at these estimates. Plot your estimated lognormal PDF against the histogram from part (a) and the estimated PDF from part (b). Report and compare your two data moments against your two model moments at the estimated parameter values.



GMM criterion function value = 0.08985203

GMM estimate for $\mu = 11.0186221247$

GMM estimate for $\sigma = 0.326161462117$

Data moments:

Mean = 85276.8236063

Standard Deviation = 17992.542128

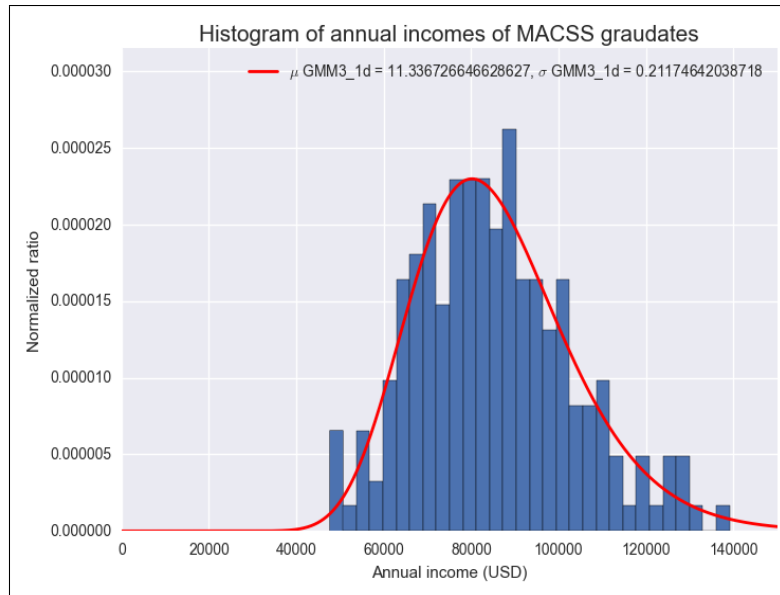
Model moments:

Mean = 63849.689103934565

Standard Deviation = 20822.5632426

(d) Estimate the lognormal PDF to

fit the data by GMM using different moments. Plot your estimated lognormal PDF against the histogram from part (a). Report the value of your GMM criterion function at the estimated parameter values. Report and compare your three data moments against your three model moments at the estimated parameter values.



GMM criterion function value = 0.23818173

GMM estimate for $\mu = 11.3367266466$

GMM estimate for $\sigma = 0.211746420387$

Data moments:

% of individuals who earn less than \$75,000 = 0.3

% of individuals who earn between \$75,000 and \$100,000 = 0.5

% of individuals who earn more than \$100,000 = 0.2

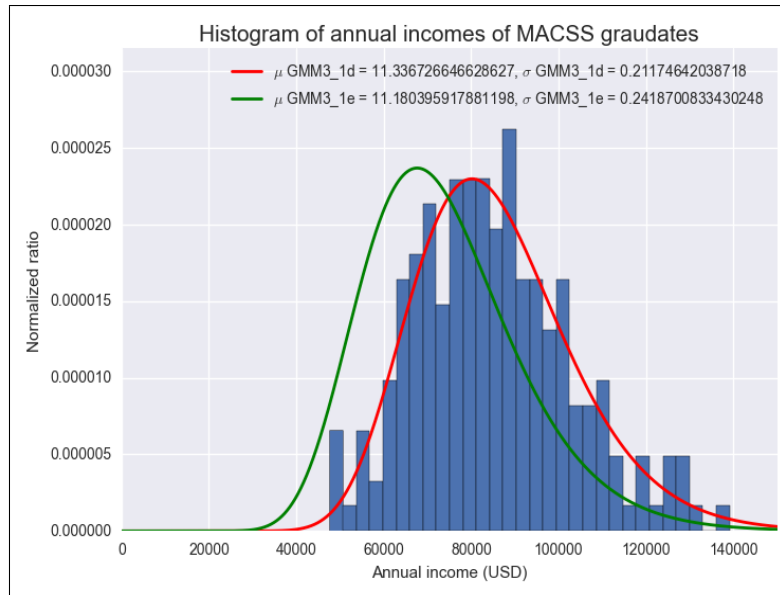
Model moments:

% of individuals who earn less than \$75,000 = 0.299272453678561

% of individuals who earn between \$75,000 and \$100,000 = 0.4980574551520791

% of individuals who earn more than \$100,000 = 0.19966278330544504

- (e) Perform the two-step GMM estimator by using your estimates from part (d) with three moments to generate an estimator for the variance covariance matrix. Report your estimates as well as the criterion function value at these estimates. Plot your estimated lognormal PDF against the histogram from part (a) and the estimated PDF from part (d). Report and compare your three data moments against your three model moments at the estimated parameter values.



GMM criterion function value = $2.89594050 \times 10^{-9}$

GMM estimate for $\mu = 11.1803959179$

GMM estimate for $\sigma = 0.241870083343$

Data moments:

% of individuals who earn less than \$75,000 = 0.3

% of individuals who earn between \$75,000 and \$100,000 = 0.5

% of individuals who earn more than \$100,000 = 0.2

Model moments:

% of individuals who earn less than \$75,000 = 0.5735500650944066

% of individuals who earn between \$75,000 and \$100,000 = 0.34185740892053457

% of individuals who earn more than \$100,000 = 0.08345289282059601

- (f) Which of the four estimations from parts (b), (c), (d), and (e) fits the data best? Justify your answer.

The graphs above suggest that, for the given choice of moments and initial parameter values, the GMM estimate using the identity matrix as the weight matrix (i.e., 1.(b) and 1.(d)) fits the data better than the other using the two-step weight matrix (i.e., 1.(c) and 1.(e)). It is more difficult to compare across estimates using different moments, e.g. between 1.(b) and 1.(d). Between 1.(b) and 1.(d), the former has a slightly thicker tail than the latter, capturing more of the middle part of the histogram. It is my view that choosing the proportions of individuals for different income groups may be superior to choosing mean and standard deviation as moments. This is because I expect the income distribution to be generally more fat-tailed than not.

2. Linear regression and GMM

- (a) Estimate the parameters of the model $(\beta_0, \beta_1, \beta_2, \beta_3)$ by GMM by solving by solving the minimization problem of the GMM criterion function. Report your estimates and report the value of your GMM criterion function.

GMM estimate for $\beta_0 = 0.251644953001$

GMM estimate for $\beta_1 = 0.0129334651063$

GMM estimate for $\beta_2 = 0.40050102133$

GMM estimate for $\beta_3 = -0.00999170755539$

GMM criterion function value = 0.00182128981749