# **Example: Estimation and Monte Carlo Analysis**

# **Summary**

The **demo.py** file in this repository shows how to run a regression using the statsmodels module and then how to carry out Monte Carlo analysis to generate the confidence interval for a key variable in a policy experiment. It also shows a number of useful features of pandas, matplotlib, and seaborn.

The example regression is a very simple model of the demand for natural gas by electric utilities. It gives the log of the natural gas (Qg) consumed by power producers as a function of the log of the real price of natural gas (Pg), the log of the real price of coal (Pc), and the log of real GDP (QDP):

$$ln(Qg) = b0 + b1*ln(Pg) + b2*ln(Pc) + b3*ln(GDP) + e$$

The Monte Carlo analysis focuses on calculating the **90% confidence interval** (CI) for the mean **revenue** that would be generated on natural gas by a \$50 per ton tax on carbon dioxide applied to both gas and coal. Revenue on gas is given by:

$$Rev = T*Cg*Qg$$

where T is the tax in dollars per metric ton of CO2, Qg is natural gas consumption in million BTU (mmBTU, see Tip 1), and Cg is a coefficient giving tons of CO2 emitted for each mmBTU of natural gas used. Revenue on coal is omitted for simplicity but in a full analysis it would be included as well.

The analysis here determines the CI for revenue accounting for uncertainty in the parameter estimates but holding the residuals, e, at 0 (hence it is the CI for mean revenue). Finally, to keep things simple, the supplies of gas and coal are assumed to be perfectly elastic.

# Input Data

All data came from the US Energy Information Administration (EIA)'s Monthly Energy Review. The input files are included in the repository in the eia subdirectory.

#### **Deliverables**

None. This is an example only and there's nothing due.

### Instructions

1. Browse the demo.py to see what techniques it demonstrates.

### **Tips**

 In the electric power sector, fossil fuels are usually priced and traded according to their energy content in millions of British Thermal Units (abbreviated mmBTU). This analysis follows that approach: in the model Qg is measured in mmBTU and Pg and Pc are in dollars per mmBTU.