

1 Partial Equilibrium Model

The effects of exogenous shocks to crop production and their welfare implications were predicted by applying a set of counterfactual production data to a partial equilibrium model for individual crops.

First, we used a linear approximation of the supply and demand schedules for each crop i by taking estimates of supply and demand elasticity and computing:

$$\textbf{Supply: } Q_{s,i} = \alpha_{s,i} + \beta_{s,i}P_i \quad (1a)$$

$$\textbf{Demand: } Q_{d,i} = \alpha_{d,i} + \beta_{d,i}P_i \quad (1b)$$

This was done using current data on the production and prices while assuming the markets were currently in equilibrium. For instance, given the price, quantity, and elasticity of demand of a commodity, we can find:

$$\begin{aligned} \beta_{d,i} &= e_{d,i} \cdot Q_i / P_i \\ \alpha_{d,i} &= Q_i - \beta_{d,i}P_i \end{aligned}$$

Data on elasticities were obtained from various sources in the literature, while price and quantity data was obtained from FAOSTAT. Counterfactual production values were calculated beforehand with a control quantity and counterfactual quantities for each year; these values modeled relative changes in supply without a demand effect, so they were used to introduce shifts to the supply curves. Each shock was introduced to the supply side of the model by adding a coefficient to the supply schedule such that

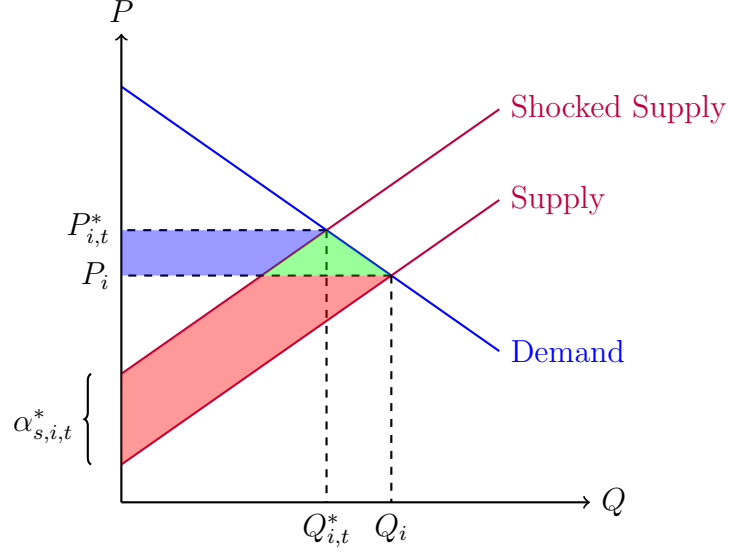
$$\textbf{Shocked Supply: } Q_{i,t}^* = \alpha_{s,i,t}^* + \alpha_{s,i} + \beta_{s,i}P_i \quad (2a)$$

where $Q_{i,t}^*$ is the counterfactual production of crop i in year t and $\alpha_{s,i,t}^*$ is a shift in the supply curve representing the shock; we solve for $\alpha_{s,i,t}^*$ for each crop at each year. Note that the counterfactual data represents relative shocks, so if the counterfactual quantity for year t was 30% smaller than the control, we would have $Q_{i,t}^* = (0.7)Q_i$ where Q_i is present day production.

After finding the appropriate supply shock, we compute the new equilibrium by solving:

$$\begin{aligned} Q_{i,t}^* &= \alpha_{s,i,t}^* + \alpha_{s,i} + \beta_{s,i}P_{i,t}^* \\ Q_{i,t}^* &= \alpha_{d,i} + \beta_{d,i}P_{i,t}^* \end{aligned}$$

where $P_{i,t}^*$ denotes the price in the counterfactual scenario. From here, we compute the welfare effects of this shock.



Along with computing changes in the consumer and producer surplus, we also compute transfers between the two. In the above figure, the blue region consists of surplus transferred from the consumer to the producer, the red region consists of surplus lost by the producer, and the green region consists of surplus lost by the consumer.

2 Multi-market Model

The multi-market model introduces cross-price elasticities between different crops and regions. We calculate welfare implications in the same way and use the same set of counterfactual data to introduce the shocks to individual crops.

To begin, we use a linear approximation of supply and demand given their elasticities as before. The supply and demand of the set of crops is computed using:

$$\textbf{Supply: } Q_s = \alpha_s + \beta_s P \quad (3a)$$

$$\textbf{Demand: } Q_d = \alpha_d + \beta_d P \quad (3b)$$

Here, β is a $n \times n$ matrix and α is a vector. Additionally, P and Q refer to the equilibrium price and quantity in the control scenario. The values of β and α are set accordingly:

$$\begin{aligned} \beta_{d,i,j} &= e_{d,i,j} \cdot Q_i / P_{i,t} \\ \alpha_d &= Q - \beta_d P \end{aligned}$$

where e is a matrix of elasticities; $e_{d,i,j}$, for example, represents the cross-price elasticity of demand between crop i and j . We treat the crops of the same type but of different origin as different crops for the analysis; that is, the Armington assumption.

The counterfactual shocks are obtained in the same way as in the partial equilibrium model. Each shock is introduced to the supply side of the model by finding an appropriate $\alpha_{s,t}^*$ to shift the intercept such that Q_t^* is supplied if prices are held constant.

$$\textbf{Shocked Supply: } Q_t^* = \alpha_{s,t}^* + \alpha_s + \beta_s P_t \quad (4a)$$

After finding $\alpha_{s,t}^*$, we then find the new equilibrium price and quantity vectors, P_t and Q_t .

Lastly, the change in welfare is computed in a similar way. Due to cross-price elasticities of demand, changes in the prices of crops in one region affect the demand curves of crops in others. Thus, there are demand shocks that result from shocking the supply. So, we make the following welfare calculations:

$$\begin{aligned} S_{L1} &= (P_t - P) \circ (Q_t^* + Q_t)/2 \\ S_{L2} &= (Q_t - Q_t^*) \circ (P_t - P) \\ S_{L3,i} &= S_{S1} - (0.5 \cdot P_i - \max((\alpha_{s,i,t}^* + \alpha_{s,i})/\beta_{s,i}, 0)) \cdot (Q_{i,t}^* + \max(0, \alpha_{s,i,t}^* + \alpha_{s,i})) \end{aligned}$$

The \circ notation refers to the Hadamard product - elementwise multiplication. We define S_{L1} as the lost consumer surplus captured by the producer, S_{L2} as the lost consumer surplus not captured by the producer, and S_{L3} as the lost producer surplus. The welfare effects are recalculated appropriately in the edge cases where $P_{i,t} \leq 0$ or $Q_{i,t} \leq 0$.