



United States Department of Agriculture

An Overview of Three Food System Models to Inform Public Policy

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Research Question and Model Framework

Research Question	Model Framework
1. Where do our food dollars go?	Input-Output Model (IO)
2. Are healthy diets sustainable?	Multiregional Environmental-Sustainable IO Model (MEIO) & Mathematical Optimization
3. How do taxes affect food markets?	Multiregional Computable General Equilibrium Model (CGE)



Where do our food dollars go?

- The U.S. Code is a consolidation and codification by subject matter of the general and permanent laws of the United States.
- TITLE 7 > CHAPTER 38 > SUBCHAPTER I > §1622 (b) of the current U.S. Code states:
 - **The Secretary of Agriculture is directed and authorized to determine costs of marketing agricultural products in their various forms and through the various channels** and to foster and assist in the development and establishment of more efficient marketing methods (including analyses of methods and proposed methods), practices, and facilities, **for the purpose of bringing about more efficient and orderly marketing, and reducing the price spread between the producer and the consumer.**



Input-Output Accounting Overview

Industry →	Agriculture, Mining, Construction & Utilities (I)	Manufacturing (II)	Freight & Trade (III)	Services (IV)	GDP	Sales
Commodity ↓	<i>\$ million</i>					
(I)	Interindustry transactions Z				y	1) $\mathbf{x} = \mathbf{Zi} + \mathbf{y}$
(II)						
(III)						
(IV)						
GDI	v'					
Outlays	2) $\mathbf{x}' = \mathbf{i}'\mathbf{Z} + \mathbf{v}'$					



Input-Output Accounting Overview

Normalize elements in transaction and value added (GDI) matrices by column sum:

$$\mathbf{A} = \mathbf{Z}\{\hat{\mathbf{x}}\}^{-1} \quad (\text{direct requirement multipliers})$$

$$\mathbf{w}' = \mathbf{v}'\{\hat{\mathbf{x}}\}^{-1} \quad (\text{unit value added income multipliers})$$

Equation 1 can be restated as:

$$\mathbf{y} = \{\hat{\mathbf{i}} - \mathbf{A}\}\mathbf{x} \Leftrightarrow \{\hat{\mathbf{i}} - \mathbf{A}\}^{-1}\mathbf{y} = \mathbf{x} \Leftrightarrow \mathbf{L}\mathbf{y} = \mathbf{x} \quad (\text{total requirement multipliers})$$

In IO accounting, total GDP equals total GDI:

$$\mathbf{i}'\mathbf{y} = \mathbf{v}'\mathbf{i} \Leftrightarrow \mathbf{i}'\mathbf{y} = \mathbf{w}'\hat{\mathbf{x}}\mathbf{i} \Leftrightarrow \mathbf{i}'\mathbf{y} = \mathbf{w}'\mathbf{x} \quad (\text{product/income identity})$$

If f denotes the subset of GDP representing personal consumption expenditures on food, linear homogeneity of production means food-related outputs and income can be measured:

$$\mathbf{L}\mathbf{y}^f = \mathbf{x}^f \quad \Leftrightarrow \quad (\text{food-related gross output})$$

$$\mathbf{i}'\mathbf{y}^f = \mathbf{w}'\mathbf{x}^f \quad \Leftrightarrow \quad (\text{food-related GDI})$$



Matrix Reduction for Supply Chain Analysis

$$\begin{bmatrix} \mathbf{x}_1 \\ \dots \\ \mathbf{x}_2 \end{bmatrix} = \begin{bmatrix} (\mathbf{I}_1 - \mathbf{A}_{11}) & -\mathbf{A}_{12} \\ -\mathbf{A}_{21} & (\mathbf{I}_2 - \mathbf{A}_{22}) \end{bmatrix}^{-1} \begin{bmatrix} \mathbf{y}_1 \\ \dots \\ \mathbf{y}_2 \end{bmatrix}$$

$$= \begin{bmatrix} \text{supply chain} & \text{non - supply chain industry use} \\ \text{industry transactions} & \text{of supply chain commodities} \\ \text{supply chain use of} & \text{non - supply chain} \\ \text{non - supply chain commodities} & \text{industry transactions} \end{bmatrix}^{-1} \begin{bmatrix} \mathbf{y}_{\text{supply chain}} \\ \dots \\ \mathbf{y}_{\text{non-supply chain}} \end{bmatrix}$$

$$\mathbf{A}^\# [1,1] = \mathbf{A}[1,1] + \mathbf{A}[1,2] \cdot \{\hat{\mathbf{i}} - \mathbf{A}[2,2]\}^{-1} \cdot \mathbf{A}[2,1] \quad \Leftrightarrow \text{(reduced dimension direct requirements)}$$

$$\mathbf{L}^\# = \{\hat{\mathbf{i}}[1] - \mathbf{A}^\#\}^{-1} \quad \Leftrightarrow \text{(reduced dimension total requirements)}$$

$$\mathbf{v}^\# = \mathbf{v}[1] + \mathbf{L}'[1,1]^{-1} \cdot \mathbf{L}'[2,1] \cdot \mathbf{v}[2] \quad \Leftrightarrow \text{(reduced dimension value-added/GDI)}$$



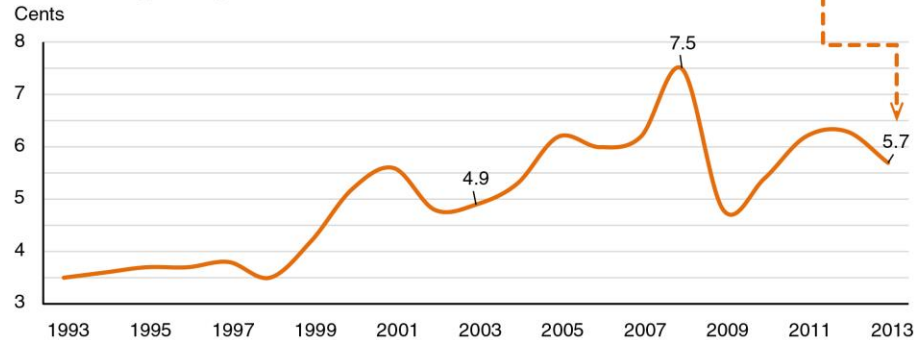
Where do our food dollars go?

$$\mathbf{v}^{\#f} = \mathbf{w}^{\#} \cdot \mathbf{L}^{\#} \cdot \mathbf{y}^f [1]$$

2013 food-at-home dollar (nominal): Industry group



Nominal energy costs per food-at-home dollar



Note: "Other" includes three industry groups: Advertising, legal and accounting, and foodservices.
 Source: USDA, Economic Research Service, Food Dollar Series data product.



Would adherence to the Dietary Guidelines for Americans reduce food-system energy use?

To specify a multiregional IO model with R regions, redefine \mathbf{y} , \mathbf{x} and \mathbf{A} as follows:

$$\mathbf{y} = [\mathbf{y}'^1 \dots \mathbf{y}'^R]' \quad \mathbf{A} = \begin{bmatrix} \mathbf{A}_1 & \dots & \mathbf{0} \\ \vdots & \mathbf{A}_r & \vdots \\ \mathbf{0} & \dots & \mathbf{A}_R \end{bmatrix}$$

$$\mathbf{x} = [\mathbf{x}'^1 \dots \mathbf{x}'^R]',$$

Denote \mathbf{T} a bilateral commodity trade coefficient matrix, summarizing all commodity (M) trade flows between origin (O) and destination (D) regions:

$$\mathbf{T} = \begin{bmatrix} \mathbf{T}_{11} & \dots & \mathbf{T}_{1D} \\ \vdots & \mathbf{T}_{o,d} & \vdots \\ \mathbf{T}_{O1} & \dots & \mathbf{T}_{O,D} \end{bmatrix}, \text{ where } \mathbf{T}_{o,d} = \hat{\mathbf{t}}_M^{o,d} \quad \forall o, d \in R \quad (\text{trade coefficient matrix})$$



Would adherence to the Dietary Guidelines for Americans (DGA) reduce food-system energy use?

Denote \mathbf{S} a sustainable indicators coefficient matrix of dimension $N \times R \times M$:

$$\mathbf{S} = \begin{bmatrix} \mathbf{S}_{1,1} & \dots & \mathbf{S}_{1,R \times M} \\ \vdots & \mathbf{S}_{n,r \times m} & \vdots \\ \mathbf{S}_{N,1} & \dots & \mathbf{S}_{N,R \times M} \end{bmatrix}, \quad \text{(material flow coefficient matrix)}$$

where $\mathbf{S}_{n,r \times m}$ represents average *material* units of indicator “ n ” embodied in each \$mil. of commodity “ m ” gross output in region ‘ r ’.

If ξ denotes the subset of each matrix element representing a primary energy source (*Btu/\$mil.*), change in embodied energy (Btu) from a transition to the DGA is measured as:

$$\mathbf{E}^{\xi} = \mathbf{S}^{\xi} \times \mathbf{L} \times \mathbf{T} \times (\mathbf{y}^{f1} - \mathbf{y}^{f0})$$



Mathematical Programming Estimates of Diet Change

Annual food expenditures represent the product of annual quantities purchased and annual average prices:

$$\mathbf{y}^f = \hat{\mathbf{p}}^f \times \mathbf{q}^f$$

Denote:

$$\mathbf{q}^{f0} = \{q_m^{f0}\}$$

observed average “Baseline Diet” (BD)

$$\Sigma = \{s_m^2\}$$

variance of observed BD

$$\mathbf{q}^{f1} = \{q_m^{f1}\}$$

unobserved average “Healthy Diet”

$$\mathbf{H} = \{h_{d,m}\}$$

nutrition attribute “ d ” content per commodity unit “ m ”



Mathematical Programming Estimates of Diet Change

When survey data measuring current average diets are normally distributed, the maximum likelihood equation is used to test the following:

Hypothesis: $\mathbf{q}^{f1} = \mathbf{q}^{f0}$

Maximize

i)
$$Z = -0.5 \times (\mathbf{q}^1 - \mathbf{q}^0)' \times \hat{\Sigma}^{-1} \times (\mathbf{q}^1 - \mathbf{q}^0)$$

subject to:

- ii) a) $\mathbf{H} \times \mathbf{q}^{f1} \geq \mathbf{h}^G$ (DGA goal constraints)
b) $\mathbf{H} \times \mathbf{q}^{f1} \leq \mathbf{h}^L$ (DGA limit constraints)
c) $q_m^{f0}, q_m^{f1} \geq 0 \forall m \in M$ (non-negative consumption constraint)
d) $\mathbf{p}^{f'} \times \mathbf{q}^1 \leq \mathbf{p}^{f'} \times \mathbf{q}^0$ (budget limit constraint)



Representative Diets

Baseline Diet

- NHANES 2007-2008

Realistic Healthy Diet

- Minimize $(\mathbf{q}^1 - \mathbf{q}^0)' \hat{\Sigma}^{-1} (\mathbf{q}^1 - \mathbf{q}^0)$
subject to
 - Calories
 - Nutrient targets
 - Food Patterns components
 - Cost

Energy Efficient Diet

- Minimize E^ξ
subject to
 - Calories
 - Nutrient targets
 - Cost

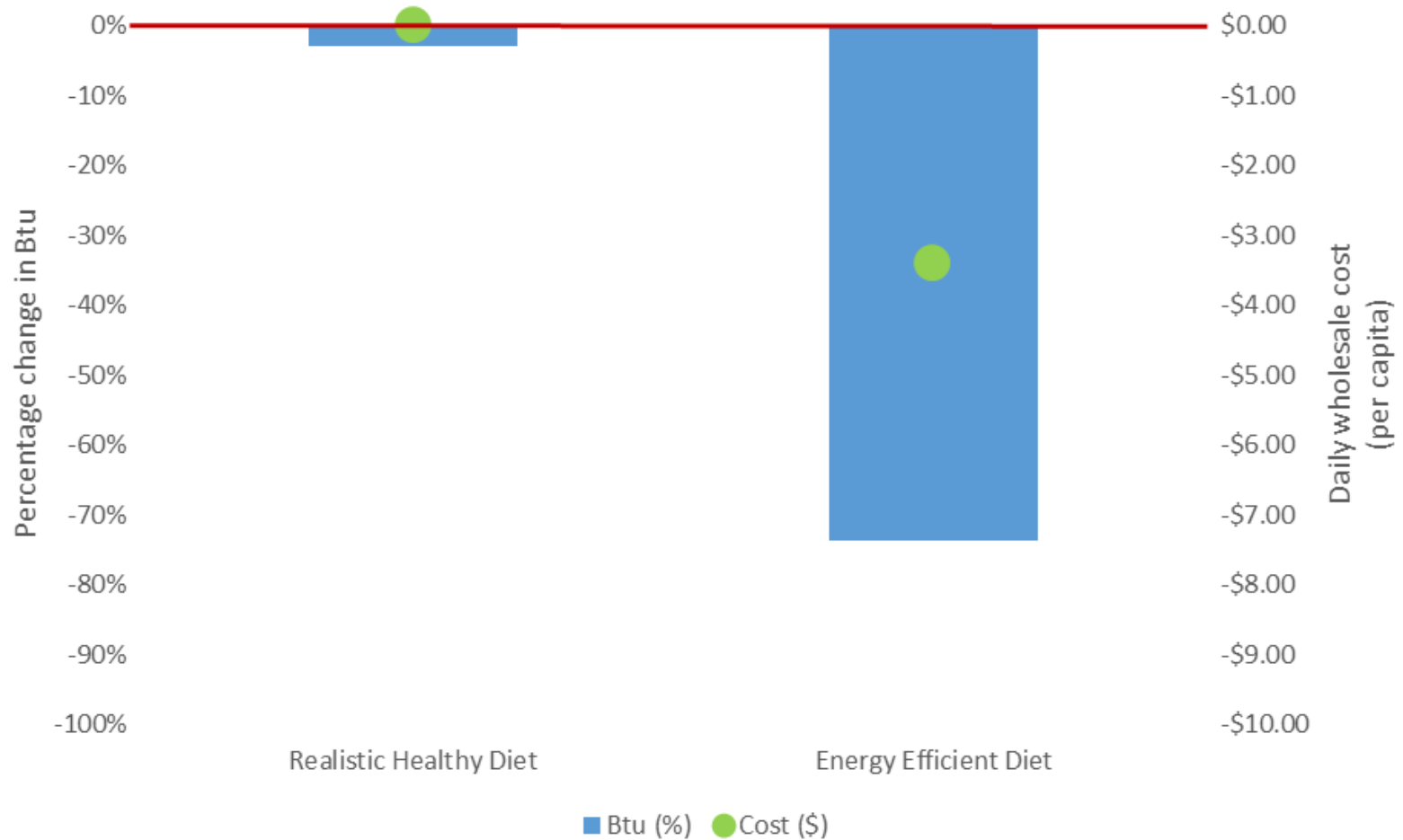


Percentage Change From Baseline Diet

	Realistic Healthy		Energy Efficient	
	Calories	BTUs	Calories	BTUs
Milk and milk products	59%	49%	62%	-42%
Meat, poultry, fish, and mixtures	-27%	8%	-96%	-95%
Eggs and egg products	19%	22%	-20%	-41%
Legumes, nuts, and seeds	131%	69%	728%	212%
Grain products	-12%	-26%	-31%	-72%
Fruits	100%	68%	-71%	-19%
Vegetables	101%	73%	-89%	-92%
Fats, oils, and salad dressings	-99%	-94%	233%	11%
Sugar, sweets, and beverages	-68%	-51%	7%	-96%



Results Relative to Baseline Diet



How do taxes affect food markets?

*Comparison of Input Output (IO) and Computable General Equilibrium (CGE) models:
(a simple closed economy, no government example)*

IO	CGE
<p>Household problem (utility maximization)</p> <p>Max $U(\mathbf{q})$, s.t. $I - \mathbf{p}'\mathbf{q} = 0$</p> <p>Consumer demand: $q_m^d = \alpha_m \times I / p_m^0, \quad \sum_m \alpha_m = 1$</p>	<p>Household problem (utility maximization)</p> <p>Max $U(\mathbf{q})$, s.t. $I - \mathbf{p}'\mathbf{q} = 0$</p> <p>consumer demand: $\mathbf{q} = g(\mathbf{p}, I)$ (Marshallian) $\mathbf{q}^h = h(\mathbf{p}, U)$ (Hicksian)</p>
<p>$p_m^0 = 1 \quad \forall m \in M$ (units = \$1 of output)</p> <p>$I = \mathbf{r}'\mathbf{k}$ (factor payments flow to household as income)</p>	<p>Notes: Primary factor prices (\mathbf{r}) and commodity output prices (\mathbf{p}) are <u>endogenous</u> in the basic CGE model. Demand properties include additivity ($\mathbf{p}'\mathbf{q}=I$), homogeneity ($g(\mathbf{p}, I)=g(\epsilon\mathbf{p}, \epsilon I)$ & $h(\mathbf{p}, U)=h(\epsilon\mathbf{p}, U)$), negativity ($dq_m^h/dp_m < 0$), and symmetry</p>
<p>Notes: $\mathbf{v}=\hat{\mathbf{r}}\mathbf{k}$, where \mathbf{k} represents a composite quantity of all primary factors (capital, labor, resources) and \mathbf{r} the composite price. Commodity prices (\mathbf{p}) are <u>exogenous</u> in the basic IO model (see producer problem).</p>	<p>$\left(\frac{dq_m^h/dp_{\tilde{m}}}{q_m^h/p_{\tilde{m}}} = \frac{dq_{\tilde{m}}^h/dp_m}{q_{\tilde{m}}^h/p_m} \quad \forall m, \tilde{m} \in M \right)$</p>



How do taxes affect food markets?

*Comparison of Input Output (IO) and Computable General Equilibrium (CGE) models:
(a simple closed economy, no government example)*

IO

CGE

Producer problem (cost minimization)

Min $\mathbf{r}'\mathbf{k}$, s.t., $\mathbf{L}\mathbf{q} - \boldsymbol{\chi}(\mathbf{k}) = 0$

commodity supply and price:

$$\boldsymbol{\chi} = \mathbf{L}\mathbf{q}$$

$$\mathbf{p} = \mathbf{L}'\hat{\mathbf{r}}\mathbf{w}$$

derived factor demand and price:

$$\mathbf{k} = \hat{\mathbf{w}}\mathbf{x}$$

$$\mathbf{r} = (\hat{\mathbf{w}}\mathbf{L}')^{-1}\mathbf{p}$$

Notes: Primary factors (\mathbf{k}) are assumed perfectly mobile between industries and in excess supply. This implies the factor rental rate is exogenous, and since \mathbf{L} and \mathbf{w} are also fixed, commodity prices are exogenous.

Min $\mathbf{r}'\mathbf{k}$, s.t., $\mathbf{L}\mathbf{q} - \boldsymbol{\chi}(\mathbf{k}) = 0$

commodity supply and price:

$$\boldsymbol{\chi} = \mathbf{L}\mathbf{q}$$

$$\mathbf{p} = \mathbf{g}^{-1}(\mathbf{q}, \mathbf{I})$$

derived factor demands:

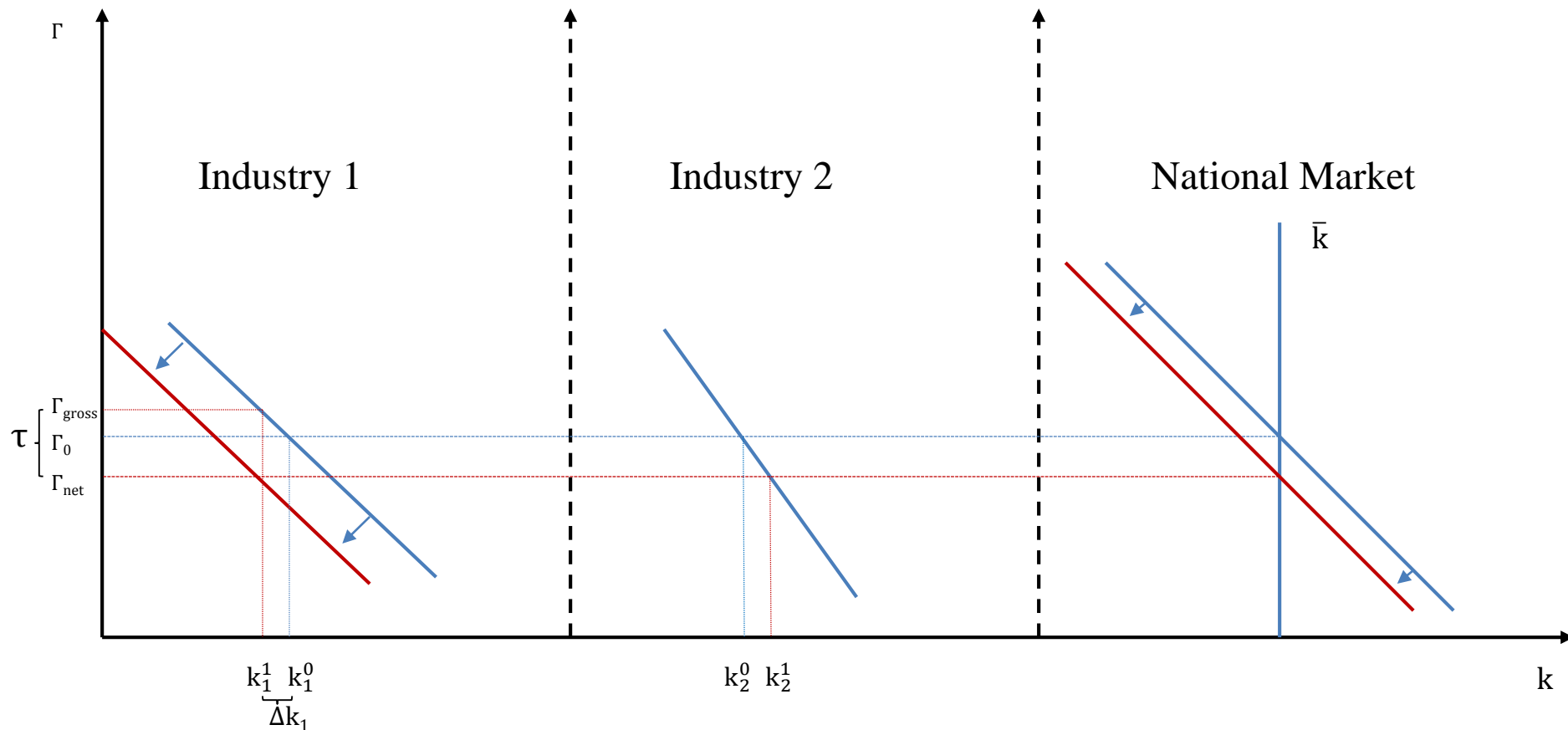
$$\mathbf{k} = \hat{\mathbf{w}}\mathbf{x}$$

$$\mathbf{r} = (\hat{\mathbf{w}}\mathbf{L}')^{-1}\mathbf{g}^{-1}(\mathbf{q}, \mathbf{I})$$

Notes: Primary factors (\mathbf{k}) are assumed perfectly mobile between industries and in fixed supply. In equilibrium, \mathbf{r} is equal to the value of marginal product.



Harberger General Equilibrium Tax Model



Social efficiency cost of tax $\approx -0.5\tau\Delta k_1$



How do taxes affect food markets?

Table 2—Impacts of Federal tax flattening on U.S. and regional food markets¹

Economic indicator/Industry	U.S.	North-east	South-east	Cornbelt	Lake	Delta	Appala- chia	No. Plains	So. Plains	Moun- tain	Pacific
<i>Percentage change</i>											
Producer price index:											
Farm	1.3	1.9	1.6	1.3	0.8	1.5	1.9	0.9	0.6	0.8	1.6
Food	-0.2	-0.4	-0.2	-0.2	-0.1	-0.2	-0.1	0.0	-0.1	-0.2	-0.5
Consumer price index:											
Farm	1.2	1.2	1.4	0.9	0.8	0.7	1.4	0.7	0.7	0.9	1.4
Food	-0.3	-0.4	-0.3	-0.3	-0.3	-0.3	-0.4	-0.3	-0.3	-0.3	-0.3
Industrial output:											
Farm	-0.4	-5.1	-1.9	-0.1	2.4	-1.3	-4.1	1.9	2.9	1.4	-2.8
Food	0.7	2.1	-0.3	0.2	-0.2	0.5	0.5	-0.6	0.0	-0.8	2.5
Net investment:											
All industries	2.3	2.8	0.8	3.0	2.9	0.3	5.8	1.5	0.3	1.5	1.2
Farm	1.3	-1.3	-0.6	2.0	4.1	-1.2	2.7	2.2	1.4	1.9	0.2
Food	2.6	4.4	-0.1	2.4	3.2	1.0	3.2	1.8	0.9	-1.0	1.7
Net foreign trade:²											
Farm	-3.5	-20.3	11.7	-0.6	-7.0	1.4	-2.4	-13.7	0.2	-21.4	-2.6
Food	(14.2)	(3.2)	(4.4)	(10.3)	(10.0)	21.6	(38.9)	17.9	(13.1)	(3.4)	(22.5)

¹ To infer the impact of current tax policy, divide the percentage changes reported by 1 minus this reported change and reverse the sign.

² Value of exports minus value of imports. Where impacts are given in parentheses, it indicates a region was a net importer in the benchmark equilibrium. For example, a positive number in parentheses suggests a decline in net imports.

Table 3—Impacts of harmonized Federal and State tax reform on retail food prices

Economic indicator	U.S.	North-east	South-east	Cornbelt	Lake	Delta	Appala- chia	No. Plains	So. Plains	Moun- tain	Pacific
<i>Percentage change</i>											
Consumer food price index	-2.2	-0.8	-5.0	-1.7	-0.7	-5.3	-5.1	-3.3	-1.4	-2.2	-0.9



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