

# NUTRITION DEMAND, SUBSISTENCE FARMING, AND AGRICULTURAL PRODUCTIVITY

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SEA Annual Meeting

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agricultural productivity ↓

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- trade costs ↓ s.t. farm commercialization 16% → 50%:
  - aggregate agricultural productivity ↑ 42%



## DATA & MODEL

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- ▶ *food* ▶ *output*

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  - ▶ *food* ▶ *output*
- Rescale HH kcal intake, output, income by HH kcal requirement
  - “per capita” measures, weighted by energy needs

## SEMI-SUBSISTENCE IS COMMON

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  - kcal self-produced: 36%
- $\frac{1}{2}$  of farms **sell none** of their output
  - avg share of output sold: 16%

## MODEL: HH PROBLEM

$$\max \left( (1 - \varphi_m) \left( \sum_{i=1}^n \varphi_i c_{h,i}^{\frac{\sigma-1}{\sigma}} \right)^{\frac{\sigma}{\sigma-1} \frac{\gamma-1}{\gamma}} + \varphi_m c_{h,m}^{\frac{\gamma-1}{\gamma}} \right)^{\frac{\gamma}{\gamma-1}}$$

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$$\sum_{i=1}^n x_{h,i}^p p_i d + p_m c_{h,m} \leq \sum_{i=1}^n x_{h,i}^s \frac{p_i}{d} + w N_h$$

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## CALORIC DEVIATION PENALTY $f$

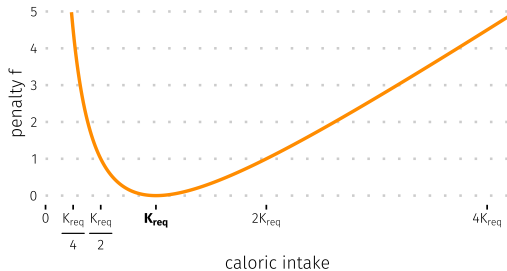
- Caloric deviation penalty fn (► *properties*):

$$f\left(\sum_i c_{h,i} k_i, K_{req,h}\right) = \psi\left(\frac{\sum_i c_{h,i} k_i - K_{req,h}}{K_{req,h}}\right)^2 \frac{K_{req,h}}{\sum_i c_{h,i} k_i}$$

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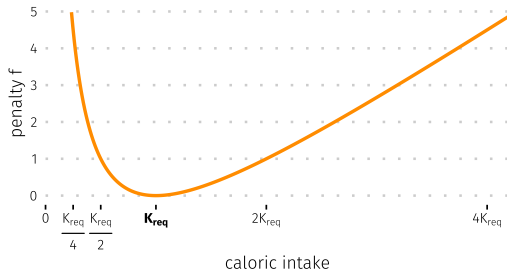
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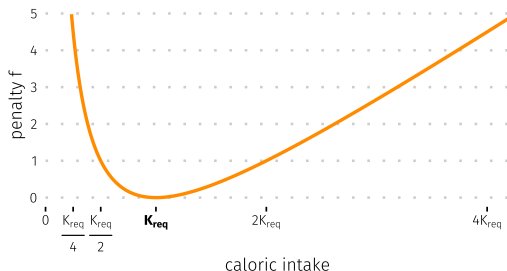


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► *details*
- Solve GE with heterogeneous goods and households ► *details*

## FARM BEHAVIOR IN MODEL AND DATA

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## FARM SIZE $\uparrow$ $\rightarrow$ SHIFT FROM DIETARY ENERGY TO DIVERSITY: MODEL & DATA

	log kcal intake	food diversity $\blacktriangleright$ <i>def</i> $\blacktriangleright$ <i>nutrients</i>
log output		
log non-farm income		
N		
Adj. $R^2$		
* $p < 0.1$ , ** $p < 0.05$ , *** $p < 0.01$		



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	log kcal intake	food diversity $\triangleright$ <i>def</i> $\triangleright$ <i>nutrients</i>
	model: $\psi = 0$	
log output	0.663 (0.002)	
log non-farm income	0.354 (0.004)	
N	29,168	
Adj. R <sup>2</sup>	0.919	

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

- $\psi = 0$  (pure CES): relative consumptions invariant to size/income
  - kcal intake  $\uparrow$  proportionally to total shadow income, diversity constant

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log output	0.663 (0.002)	-0.082 (0.002)
log non-farm income	0.354 (0.004)	0.041 (0.002)
N	29,168	29,168
Adj. R <sup>2</sup>	0.919	0.085

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	model: $\psi = 0$	model: benchmark	model: $\psi = 0$
log output	0.663 (0.002)	0.124 (0.001)	-0.082 (0.002)
log non-farm income	0.354 (0.004)	0.084 (0.001)	0.041 (0.002)
N	29,168	33,613	29,168
Adj. $R^2$	0.919	0.393	0.085

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- $\psi > 0$  (benchmark): reallocate resources from calories to diversity as size/income  $\uparrow$ 
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log output	0.663 (0.002)	0.124 (0.001)	-0.082 (0.002)	0.428 (0.002)
log non-farm income	0.354 (0.004)	0.084 (0.001)	0.041 (0.002)	0.396 (0.002)
N	29,168	33,613	29,168	33,613
Adj. R <sup>2</sup>	0.919	0.393	0.085	0.762

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log non-farm income	0.354 (0.004)	0.084 (0.001)	0.063*** (0.004)	0.041 (0.002)	0.396 (0.002)
N	29,168	33,613	8,674	29,168	33,613
Adj. R <sup>2</sup>	0.919	0.393	0.063	0.085	0.762

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log output	0.663 (0.002)	0.124 (0.001)	0.091*** (0.005)	-0.082 (0.002)	0.428 (0.002)	0.395*** (0.034)
log non-farm income	0.354 (0.004)	0.084 (0.001)	0.063*** (0.004)	0.041 (0.002)	0.396 (0.002)	0.857*** (0.033)
N	29,168	33,613	8,674	29,168	33,613	8,675
Adj. R <sup>2</sup>	0.919	0.393	0.063	0.085	0.762	0.131

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

- $\psi = 0$  (pure CES): relative consumptions invariant to size/income
  - kcal intake  $\uparrow$  proportionally to total shadow income, diversity constant
- $\psi > 0$  (benchmark): reallocate resources from calories to diversity as size/income  $\uparrow$ 
  - small farmers focus consumption on calories
  - large farmers diversify diet

## SELLING BEHAVIOR: MODEL & DATA

### SALES ARE SPECIALIZED ► *details*

- **MODEL** & **DATA**: sales are specialized compared to overall production
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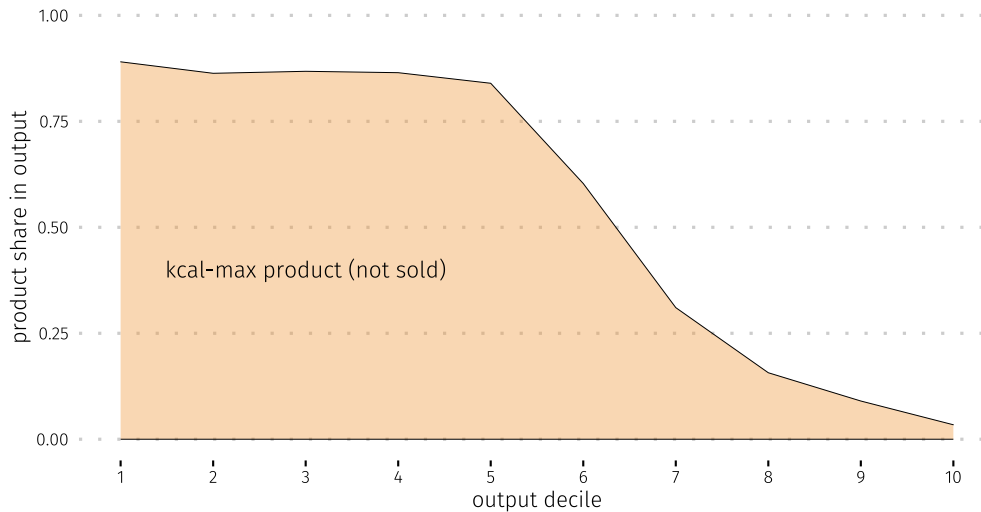
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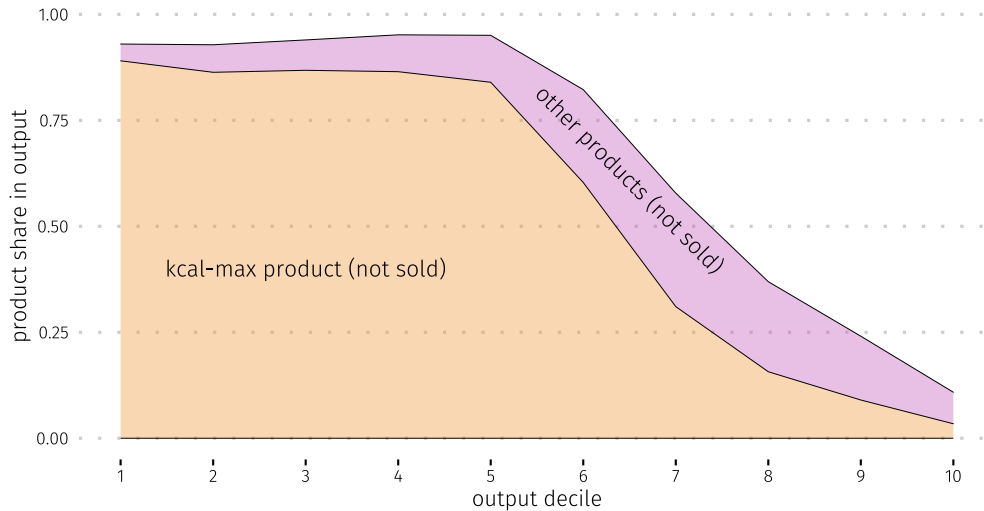
### LARGE FARMS ARE MORE ACTIVE SELLERS ► *details*

- **MODEL** & **DATA**: farm size ↑ → sell bigger fraction of output
- **model mechanism**: size ↑ → reallocate cons. to diversity, manuf. → need revenue

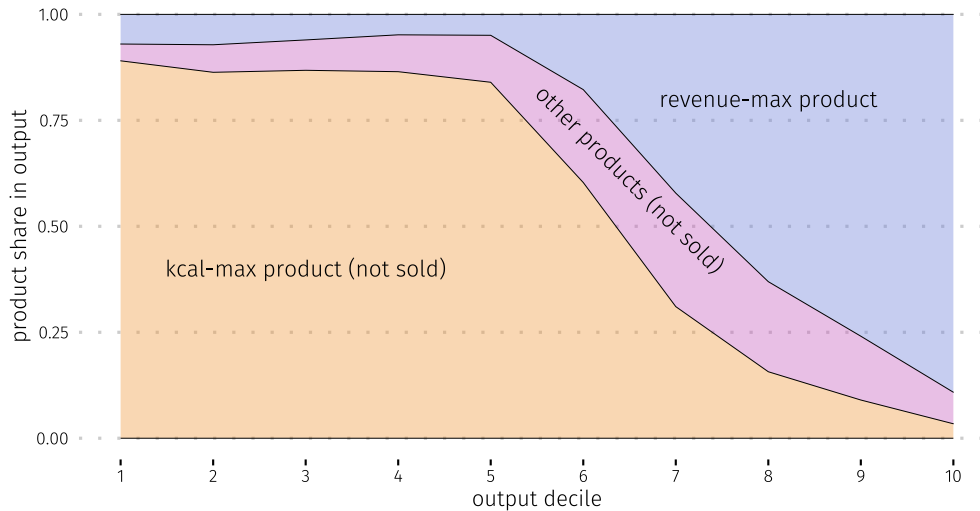
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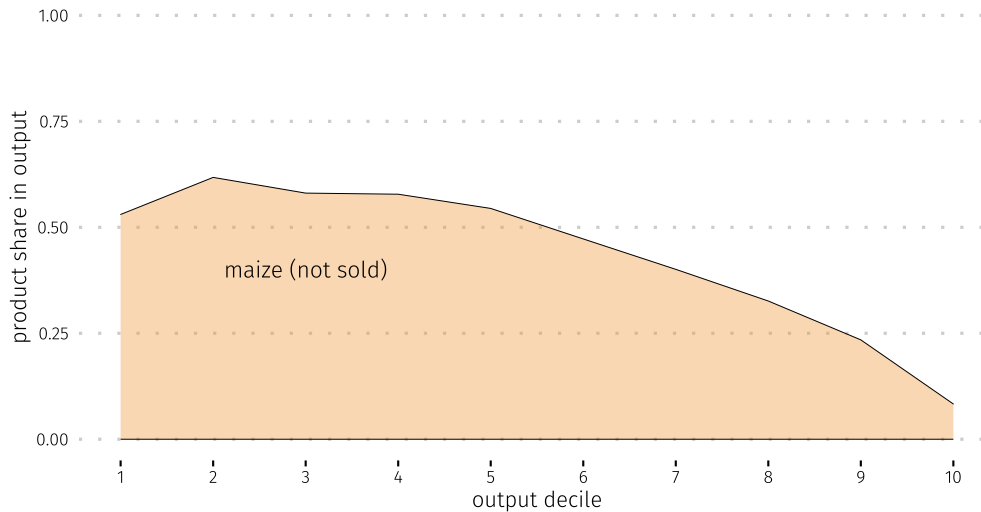
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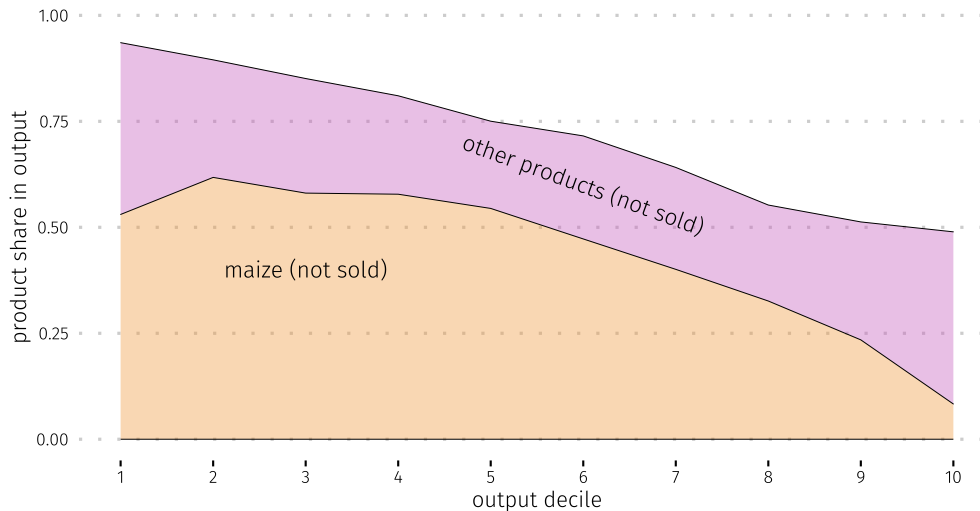
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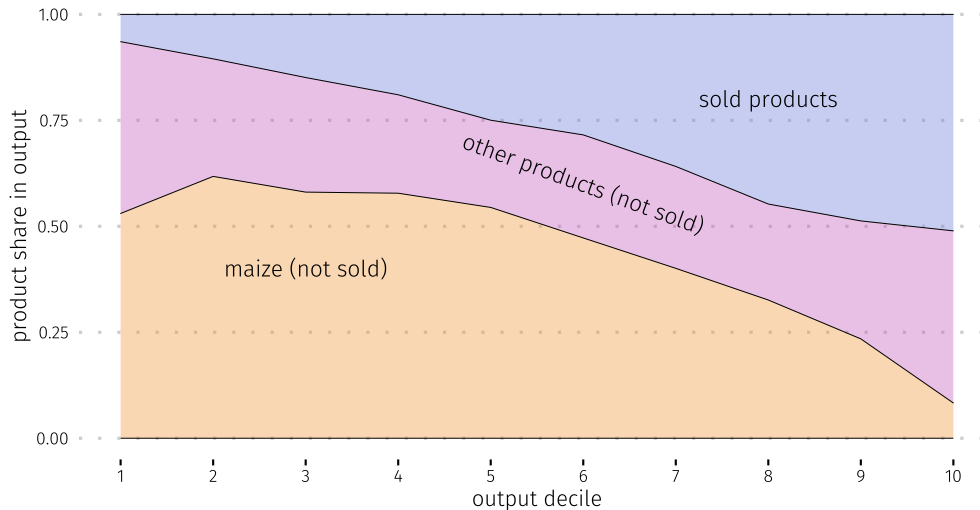
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# AGGREGATE PRODUCTIVITY

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  - half because improved product choice, half because less is lost to trade cost

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back

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[back](#)

## $f(\sum_i c_i k_i, K_{req})$ PROPERTIES

Properties:

1.  $f(bK_{in}, bK_{req}) = f(K_{in}, K_{req})$

(homogeneity of deg. 0)

2.  $f(bK_{req}, K_{req}) = f\left(\frac{K_{req}}{b}, K_{req}\right)$

(symmetry around  $K_{req}$  in ratios)

3.  $\min_{K_{in} > 0} f(K_{in}, K_{req}) = f(K_{req}, K_{req}) = 0$

(minimum and zero if eat  $K_{req}$ )

4.  $f_{11}(K_{in}, K_{req}) = \frac{2\psi K_{req}}{K_{in}^3} > 0$

(convex in intake)

back

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- Consider the problem of a household
- Suppose  $\psi = 0$  (pure CES)

$$MU_i^{\text{CES}}(c_i) = MC_i \quad (c_i \text{ FOC})$$

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▶ *Calibration: parameters & moments*

## AGRICULTURAL GOODS USED IN CALIBRATION

- Selected goods:
  1. maize
  2. pigeonpea
  3. groundnut
  4. tomato
  5. soybean
  6. tobacco
- These goods account for, on average,
  - 70% of HH output market value
  - 43% of HH food consumption market value

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## GENERAL EQUILIBRIUM: AGRICULTURAL GOODS

- Solve for agricultural prices  $\{p_i\}_i$  s.t. edible good markets clear:

$$\frac{1}{d} \sum_h x_{h,i}^s = d \sum_h x_{h,i}^p \quad \forall i$$

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  - data: tobacco accounts for 60% of Malawi's exports
  - **tobacco** traded internationally at exogenous  $\bar{p}_t$

$$\underbrace{\bar{p}_{\text{tobacco}} \left( \frac{1}{d} \sum_h x_{h,\text{tobacco}}^s - d \sum_h x_{h,\text{tobacco}}^p \right)}_{\text{tobacco exports}}$$

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- Tobacco market doesn't need to clear
  - data: tobacco accounts for 60% of Malawi's exports
  - **tobacco** traded internationally at exogenous  $\bar{p}_t$
  - some **manufactured good** is imported to balance the trade:

$$\underbrace{\bar{p}_{\text{tobacco}} \left( \frac{1}{d} \sum_h x_{h,\text{tobacco}}^s - d \sum_h x_{h,\text{tobacco}}^p \right)}_{\text{tobacco exports}} = \underbrace{p_m \left( \sum_h c_{h,m} - Y_m \right)}_{\text{manuf. good imports}}$$

## FARM SALES ARE SPECIALIZED: MODEL & DATA

- **MODEL:** each farm sells at most one good

back

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back

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back



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  - 69% sell just 1 good, only 9% produce just 1 good
  - on avg, top good accounts for 91% in sales but 67% in output

back

## LOWER TRADE COSTS $\rightarrow$ ALL SPECIALIZE: MODEL & DATA

- **MODEL:**  $d \downarrow \rightarrow$  specialize production
  - below some cutoff  $\tilde{d}_h$ , HH  $h$  only produces the revenue-maximizing good

back

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- **MODEL:**  $d \downarrow \rightarrow$  specialize production
  - below some cutoff  $\tilde{d}_h$ , HH  $h$  only produces the revenue-maximizing good
- **DATA:**
  - HHs with better market access specialize production
    - ▶ *table*

back

## LARGE FARMS SELL MORE: MODEL & DATA

- Larger farms are more active sellers:

output quartile	<u>sold output share</u>
--------------------	--------------------------

1	
---	--

4	
---	--

back

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size ↑

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size  $\uparrow$   $\longrightarrow$  energy intake  $\uparrow$

$\nearrow$  food diversity  $\uparrow$

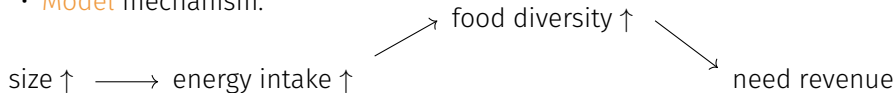
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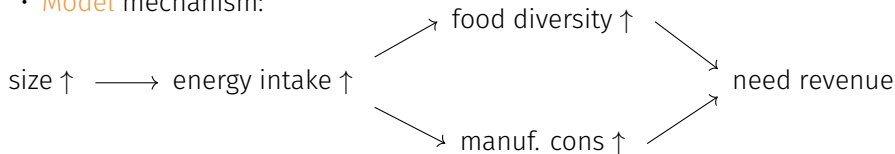
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back

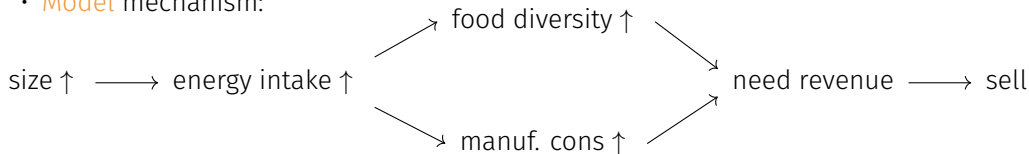
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back

## CUTOFF TRADE COST $\bar{d}$

$$\bar{d}_h = \sqrt{\frac{\max_i p_i z_{h,i}}{\min_i p_i / k_i \cdot \max_i k_i z_{h,i}}}$$

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## PRODUCTION DIVERSITY

- Production Diversity = Inverse Simpson Index

$$\text{Production Diversity}_h = \left( \sum_{i=1}^n \left( \frac{\text{output}_{h,i}}{\sum_{j=1}^n \text{output}_{h,j}} \right)^2 \right)^{-1}$$

where  $n$  is the total number of agricultural products,  $\text{output}_{h,i}$  is the market value of product  $i$  produced by  $h$ 's farm.

- Simpson Index: sum of squared product output shares within farm's output
  - same as HHI
  - interpretation: probability that two random dollars of output come from the same product
- Inverse Simpson Index =  $\frac{1}{SI}$ , commonly used in measuring species diversity



## FOOD DIVERSITY

- Food Diversity = Inverse Simpson Index

$$\text{Food Diversity}_h = \left( \sum_{i=1}^n \left( \frac{\text{food quantity}_{h,i} \times \text{median purchase price}_i}{\sum_{j=1}^n \text{food quantity}_{h,j} \times \text{median purchase price}_j} \right)^2 \right)^{-1}$$

where  $h$  is the HH index,  $n$  is the total number of distinct foods in the dataset.

- Simpson Index: sum of squared food shares within HH's consumption
  - same as HHI
  - interpretation: probability that two random dollars of (shadow) food expenditure come from the same product
- Inverse Simpson Index =  $\frac{1}{S}$ , commonly used in measuring species diversity

## NUTRIENT RICHNESS

	NRF9		NRF9.3	
	(1)	(2)	(3)	(4)
log output	17.046*** (0.964)	5.695*** (0.724)	-13.296*** (3.326)	-13.400*** (3.358)
log non-farm income	10.285*** (0.792)	2.441*** (0.603)	-7.257** (3.898)	-7.305** (3.548)
log kcal intake		124.025*** (2.282)		0.550 (26.234)
N	8,675	8,674	8,675	8,674
Adj. R <sup>2</sup>	0.054	0.451	0.002	0.002

\* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01

- NRF9: sum of daily intakes (relative to recommended level) of 9 nutrients
- NRF9.3: subtracts the relative excessive consumption of 3 disqualifying nutrients

## LOWER TRADE COSTS → ALL SPECIALIZE: DATA

---

production diversity

---

---

N

Adj. R<sup>2</sup>

---

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NOTE. Controls: log output, log non-farm income.

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## LOWER TRADE COSTS → ALL SPECIALIZE: DATA

---

production diversity

---

sold output share

---

N

Adj. R<sup>2</sup>

---

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NOTE. Controls: log output, log non-farm income.

back

## LOWER TRADE COSTS → ALL SPECIALIZE: DATA

	production diversity
sold output share	-0.044*** (0.016)
N	4,042
Adj. R <sup>2</sup>	0.025

\* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01

NOTE. Controls: log output, log non-farm income.

back

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	production diversity
sold output share	-0.044*** (0.016)

1 [good mkt access]

N	4,042
Adj. R <sup>2</sup>	0.025

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

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## LOWER TRADE COSTS → ALL SPECIALIZE: DATA

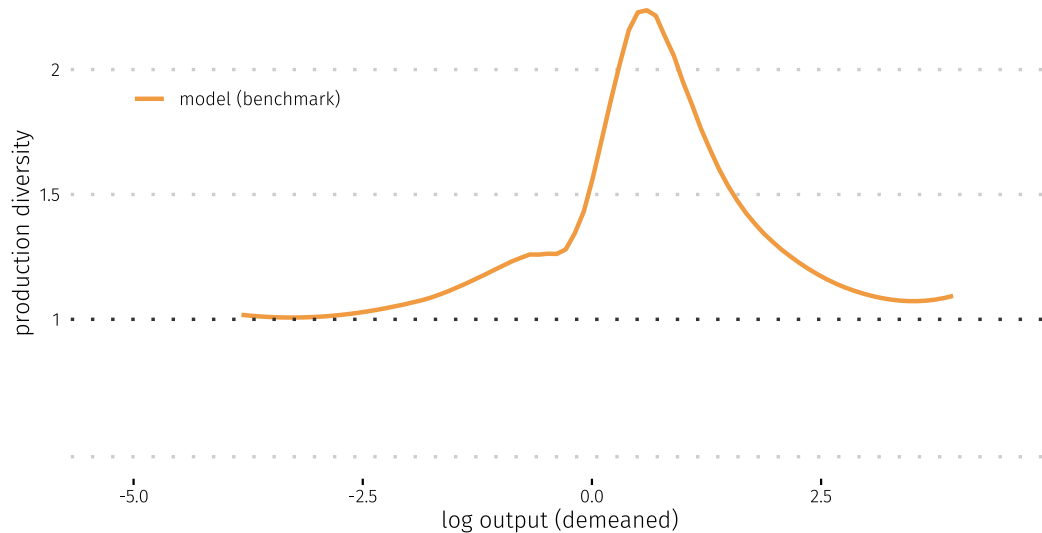
	production diversity	
sold output share	-0.044*** (0.016)	
1 [good mkt access]		-0.164*** (0.018)
N	4,042	8,675
Adj. R <sup>2</sup>	0.025	0.099

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

NOTE. Controls: log output, log non-farm income.

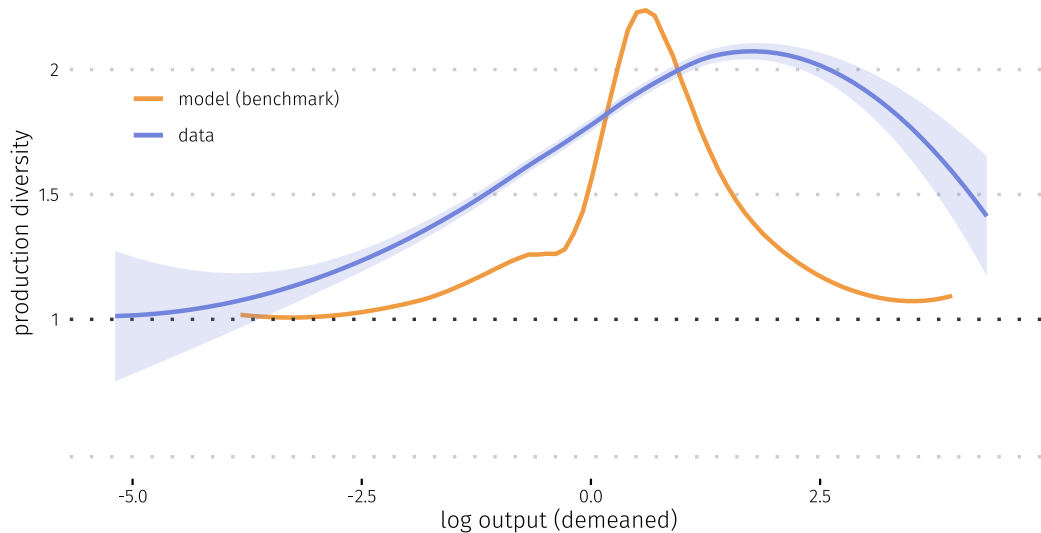
back

## LARGER FARMS DIVERSIFY, LARGEST SPECIALIZE: MODEL & DATA

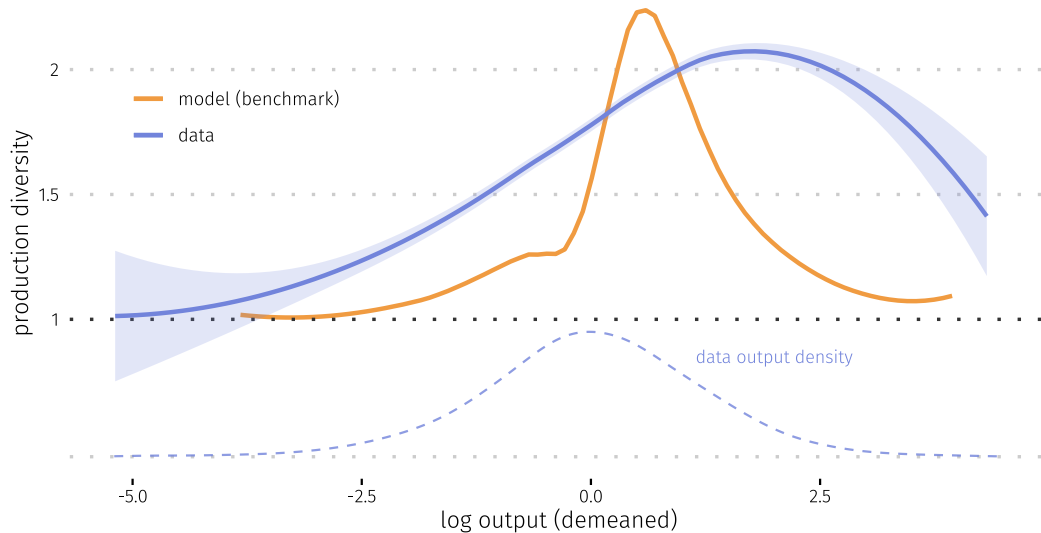




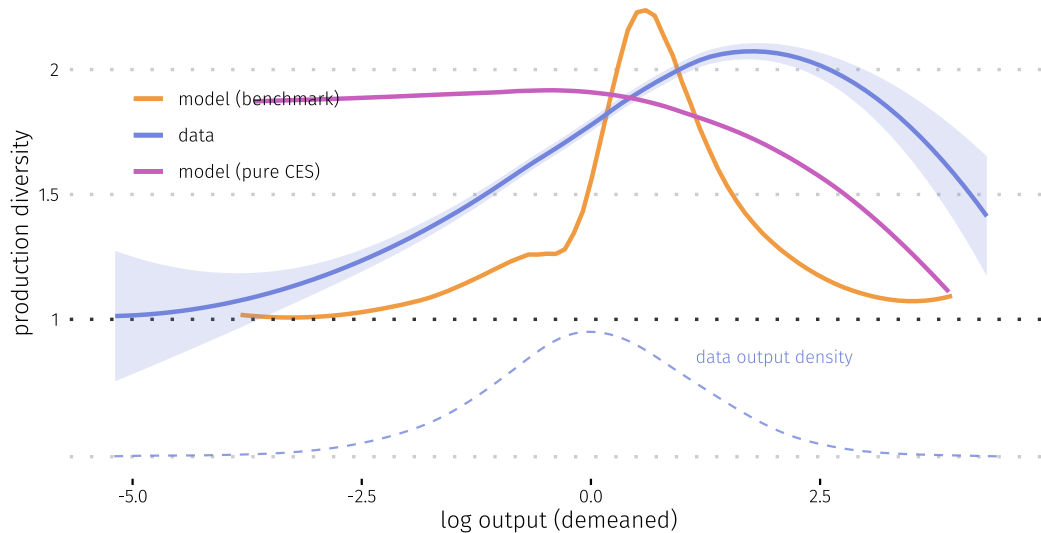
## LARGER FARMS DIVERSIFY, LARGEST SPECIALIZE: MODEL & DATA



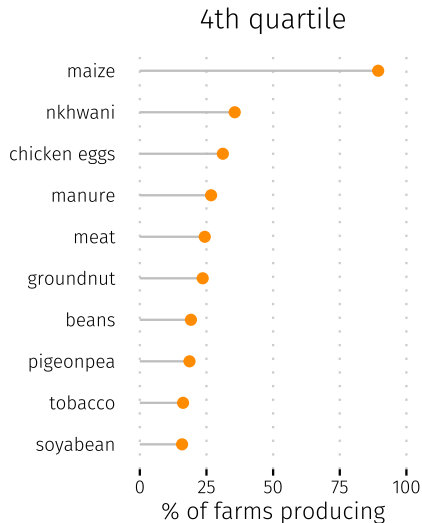
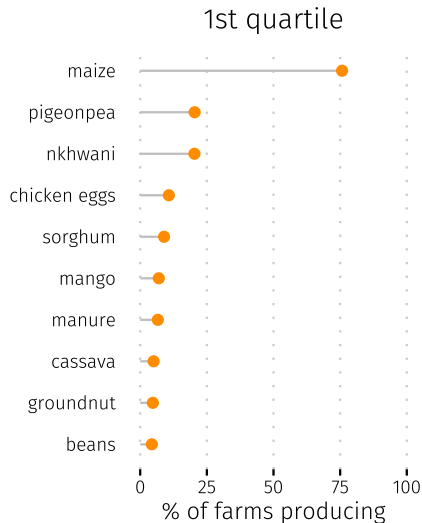
## LARGER FARMS DIVERSIFY, LARGEST SPECIALIZE: MODEL & DATA



## LARGER FARMS DIVERSIFY, LARGEST SPECIALIZE: MODEL & DATA



## PRODUCT FREQUENCY BY SIZE: DATA



## ESTIMATION

parameter	value	moment/source	data moment	model moment
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Distributions

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## ESTIMATION

parameter	value	moment/source	data moment	model moment
<b>Distributions</b>				
$\mathbb{E}(\log L_h)$	-15	avg $K_{in,h}/K_{req,h}$	1.036	0.902

## ESTIMATION

parameter	value	moment/source	data moment	model moment
<b>Distributions</b>				
$\mathbb{E}(\log L_h)$	-15	avg $K_{in,h}/K_{req,h}$	1.036	0.902
$V(\log L_h)$	1.5	$V(\log \text{output}_h)$	1.528	1.385

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$P(N_h = 0)$	0.112	$P(\text{non-farm income}_h = 0)$	0.112	0.117



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$\sigma$ (EoS across foods)	0.75	estimated	—	—

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$\gamma$ (EoS between food & manuf.)	1	—	—	—

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<b>Parameters</b>				
$\sigma$ (EoS across foods)	0.75	estimated	—	—
$\gamma$ (EoS between food & manuf.)	1	—	—	—
$d$ (agricultural trade cost)	1.75	avg share sold	0.159	0.203

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$\mathbb{E}(\log L_h)$	-15	avg $K_{in,h}/K_{req,h}$	1.036	0.902
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$d$ (agricultural trade cost)	1.75	avg share sold	0.159	0.203
$\psi$ (kcal deviation penalty)	0.5	output elasticity of $K_{in}$	0.091	0.124

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$\mathbb{E}(\log L_h)$	-15	avg $K_{in,h}/K_{req,h}$	1.036	0.902
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<b>Good characteristics</b>				

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<b>Good characteristics</b>				
$\varphi_m$ (manuf. taste weight)	0.5	$\frac{\text{aggr. non-farm income}}{\text{aggr. farm output}}$	1.539	1.632

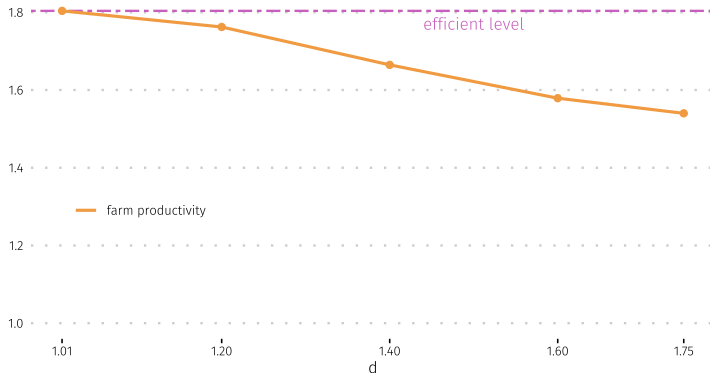


## ESTIMATION

parameter	value	moment/source	data moment	model moment
<b>Distributions</b>				
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<b>Parameters</b>				
$\sigma$ (EoS across foods)	0.75	estimated	—	—
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<b>Good characteristics</b>				
$\varphi_m$ (manuf. taste weight)	0.5	$\frac{\text{aggr. non-farm income}}{\text{aggr. farm output}}$	1.539	1.632
$\bar{p}_{\text{tobacco}}/p_{\text{maize}}$	5.4	aggr. tobacco output share	0.091	0.094

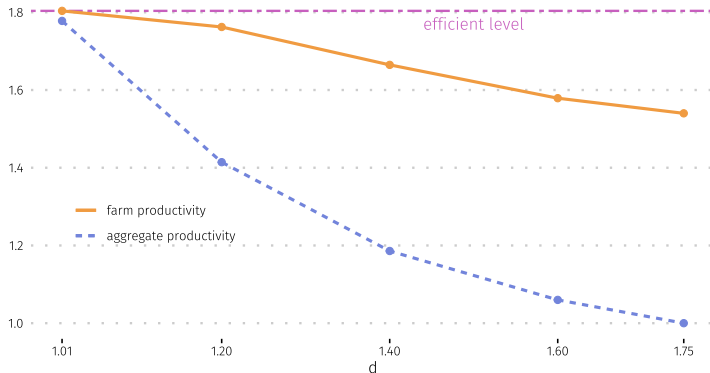
## TRADE COSTS ↓ → AGGREGATE PRODUCTIVITY ↑

- Compare “farm-gate” production to final consumption (“aggregate productivity”)
  - farm production only accounts for product choice changes



## TRADE COSTS $\downarrow \rightarrow$ AGGREGATE PRODUCTIVITY $\uparrow$

- Compare “farm-gate” production to final consumption (“aggregate productivity”)
  - farm production only accounts for product choice changes
  - final consumption also accounts for mechanical losses from  $d$

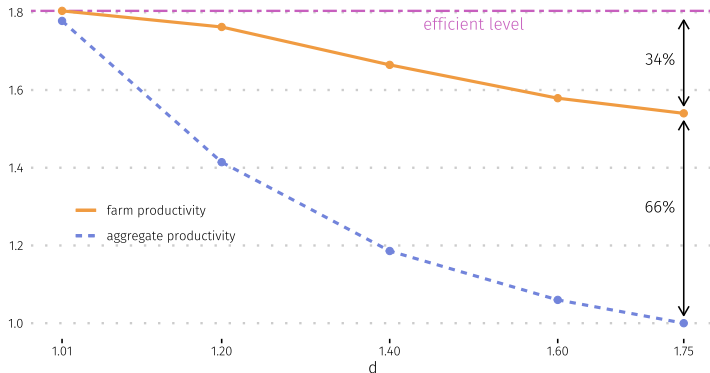


$d \rightarrow 1$ :

aggr. productivity  $\uparrow$  78%

## TRADE COSTS $\downarrow \rightarrow$ AGGREGATE PRODUCTIVITY $\uparrow$

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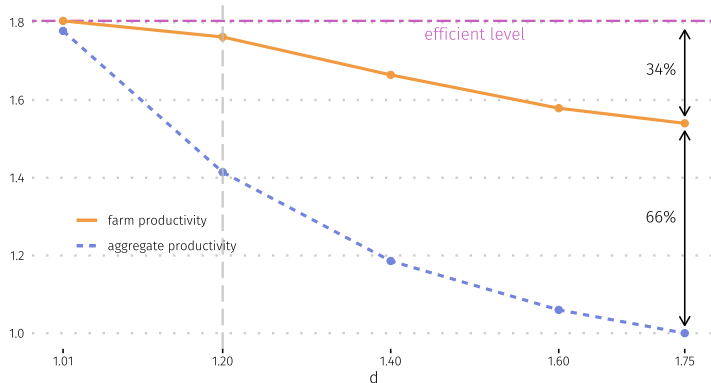


$d \rightarrow 1$ :

aggr. productivity  $\uparrow 78\%$  ( $\frac{1}{3}$  due to product choice)

## TRADE COSTS $\downarrow \rightarrow$ AGGREGATE PRODUCTIVITY $\uparrow$

- Compare “farm-gate” production to final consumption (“aggregate productivity”)
  - farm production only accounts for product choice changes
  - final consumption also accounts for mechanical losses from  $d$



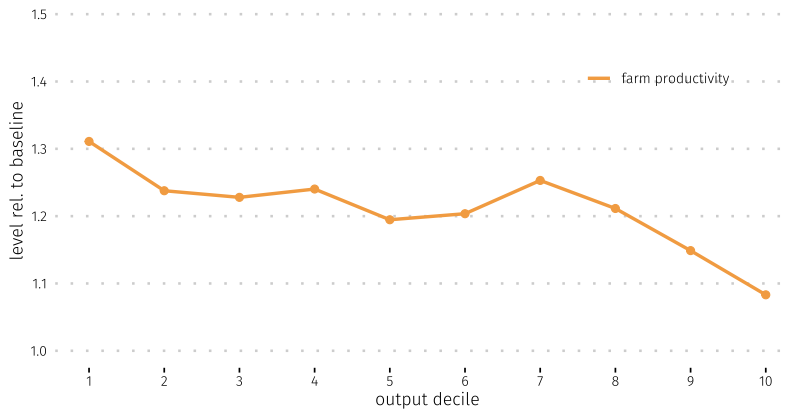
- $d \rightarrow 1$ : aggr. productivity  $\uparrow 78\%$  ( $\frac{1}{3}$  due to product choice)
- $d \downarrow$  s.t. avg share sold 16%  $\rightarrow$  50%: aggr. productivity  $\uparrow 42\%$  ( $\frac{1}{2}$  due to product choice)

## TRADE COSTS $\downarrow \rightarrow$ HETEROGENEOUS EFFECTS IN FARM SIZE

- $d \downarrow$  s.t. avg share sold 16%  $\rightarrow$  50%:

## TRADE COSTS ↓ → HETEROGENEOUS EFFECTS IN FARM SIZE

- $d$  ↓ s.t. avg share sold 16% → 50%:
  - farm productivity: small ↑ the most, large ↑ the least



## TRADE COSTS ↓ → HETEROGENEOUS EFFECTS IN FARM SIZE

- $d \downarrow$  s.t. avg share sold 16% → 50%:
  - farm productivity: small ↑ the most, large ↑ the least
  - consumption: small ↑ the most, medium ↑ the least

