# Consumption Quality: A New Perspective on the Welfare Implications of Business Cycle Fluctuations

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#### Overview

# Two Long-standing Questions in Household Finance and Macroeconomics

- 4 How do economic shocks affect household consumption?
- What are the welfare costs?

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#### Overview

# Two Long-standing Questions in Household Finance and Macroeconomics

- 4 How do economic shocks affect household consumption?
- What are the welfare costs?

#### State of Literature

- Examine effects on total consumption expenditures.
- Lucas calculation
  - $\bullet$  Welfare gain of eliminating spending volatility  $\approx 0.05\%$  of spending.
  - Incorporating additional features (incomplete markets, income insurance) yields  $\approx 0.1\%$  of spending.

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# New Perspective

Instead of total consumption expenditures, we zoom into consumption bundles and composition:

- Households smooth consumption at both the quality and quantity margin when facing income shocks.
- Quality v. quantity margin of consumption reallocation has important welfare implications.

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#### Motivation

"Consumers choose the *quality* of their purchases, and unit values reflect this choice. Moreover, quality choice may itself reflect the influence of prices as consumers respond to price changes by altering both quantity and quality."

— Angus Deaton (1988)

"The analysis of quality is an important topic in economics"

— Angus Deaton and John Muellbauer (1980)

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### Research Questions

- To what extent do households exploit quantity versus *quality* margins of adjustments in their consumption decision?
- We have does this quantity-quality choice affect welfare implications of economic shocks?

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# This Paper

#### • Empirical:

- Quantify quality margin adjustment as a consumption smoothing mechanism, using granular panel data on household consumption.
  - Given negative income shock, 2/3 of expenditure reduction is due to adjustment at the quality margin.
- Show considerable heterogeneity across income groups in their access to this consumption smoothing channel.
  - The low income groups are "quality constrained".

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# This Paper

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  - The low income groups are "quality constrained".

#### Theory:

- Non-homothetic preferences.
  - Households value both the quality and quantity margins of household consumption.
- Estimate welfare costs of income fluctuations for the full income distribution.
  - The low income groups bear a a disproportionately greater share of the cost of business cycle fluctuations.

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#### Outline

- Data and Quality Measures
- 2 Empirical Analysis
- $\odot$  Empirics  $\Rightarrow$  Theoretical Framework
- Theory and Welfare Analysis

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#### I. Data

- Nielsen household panel dataset (2004-2013)
  - Transaction data: 4 million household purchase transactions
    - Scanned Universal Product Code (UPC) level data— (Trip specific:) Date, store, quantity, price, deals; (Product specific:) Brand, type, volume, packaging.
  - Product data
    - Food departments: dairy, deli, dry grocery, fresh produce, frozen food, packaged meat;
    - Non-food departments: alcohol, general merchandise, health, non-food grocery.
  - Demographic data: 98,547 households.
    - Yearly self-reported household-level data: income, age, sex, race, education, occupation, region of residency, employment status, family composition and household size.
- Nielsen Retailer Scanner Data (2006-2013)
  - Weekly point-of-sale information from 35,000 stores.
  - UPC level data—total sales in revenue and quantity

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# I. Data Dimensions on Product Groups

- Departments
  - Ex.: "Dairy"
- Product Modules
  - Ex.: "Dairy-Milk-Refrigerated"
- UPCs
  - Ex.: "Berkeley Farmers Organic 2% Milk"

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# I. Defining Quality

#### **Fundamental Assumptions**

- When buying a product (fresh milk) households choose
  - How much milk to buy
  - What quality of milk to buy
- Extract quantity directly from the data
- Need measure for quality, reflecting
  - Perceived quality value

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# I. Defining Quality (cont')

#### Price contains information about quality

- Demand theory
  - Revealed preferences If A > B and  $P_A > P_B$  then quality of A is higher than B.
- Supply theory
  - Marginal costs If MC is increasing in quality  $\Rightarrow$  Price is increasing in quality.

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# I. Quality Measures

#### Set 1: Baseline

Average Price

#### Set 2: Quality Ranking

- UPC Price Ranking
- UPC Relative Price Ranking

#### Set 3: Quality Ladder

- Within-Store Quality Ladder
- Cross-Store Quality Ladder
- Overall Quality Ladder

\*All measures are constructed within product module-size unit.

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# I. Quality Measure Set 1 – Average Price

#### **Average Price**

$$P_{hgt} = \frac{X_{hgt}}{\sum_{u} c_{hut}} \tag{1}$$

- $X_{hgt}$  = Total expenditure in product-module g by household h in month t:  $\sum_{u} c_{hut} \cdot p_{hut}$
- c<sub>hut</sub> : Volumes purchased of UPC u
- p<sub>hut</sub>: Unit price of UPC u

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# I. Quality Measure Set 2 – UPC Price Ranking

#### Average UPC ranking of household purchases

$$R_{hgt} = \sum_{u} s_{hut} \cdot R_u \tag{2}$$

- s<sub>hut</sub> : UPC budget share
- $R_u$  proxies for a *quality index* : higher  $R_u$  means better quality

$$ullet$$
  $R_u=rac{ ilde{R}_u}{ ilde{R}^{max}+1}\in(0,1)$ 

- $\tilde{R}_u = \omega_u \cdot rank(p_u|p_1, p_2, \dots, p_N)$
- $p_u$ : Yearly unit price
- $\bullet$   $\omega_u$ : UPC Scantrack marketshare
- $\tilde{R}^{max} \equiv \max \tilde{R}_u$

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# I. Quality Measure Set 2 – Relative UPC Price

#### Alternative UPC ranking of household purchases

$$R'_{hgt} = \sum_{u} s_{hut} \cdot \log \left( p_{ut} / p_{ut}^{med} \right). \tag{2'}$$

•  $s_{hut}$  : UPC Budget share

•  $p_{ut}$  : *Unit* price

 $\bullet$   $p_{ut}^{med}$ : Median *unit* price

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# I. Quality Measure Set 3 – Quality Ladders

#### Within-Store Quality Ladder

$$x_{hc,g,t}^{UPC} = x_{hc,g,t} - \sum_{w \in t} \sum_{s} \sum_{u} c_{hw,u} \cdot \min_{u} \{ p_{hw,s,u} \}$$
 (3)

#### Cross-Store Quality Ladder

$$x_{hc,g,t}^{Store} = x_{hc,g,t} - \sum_{w \in t} \sum_{u} c_{hw,u} \cdot \min_{s} \{ p_{hw,s,u} \}$$
 (3')

#### **Overall Quality Ladder**

$$x_{hc,g,t}^{Extreme} = x_{hc,g,t} - \sum_{w \in t} \sum_{u} c_{hw,u} \cdot \min_{s,u} \{ p_{hw,s,u} \}$$
 (3")

- w : Week
- s : Store
- c: Number of Items  $\Rightarrow p$ : Actual price or Volume  $\Rightarrow p$ : Unit price

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#### Outline

- Defining and Calculating Quality
- Empirical Analysis
- 3 Theory and Welfare Analysis

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## II. Empirics – Reduced Form Estimation

#### Regression Model

$$Y_{hc,g,t} = \beta_1 U E_{ct} + \beta_2 U E_{ct} \times I_{h,l,t} + \theta' X_{h,t} + \zeta_{h,g} + \eta_t + \varepsilon_{hc,g,t}$$
(4)

- $Y_{hc,g,t}$ : Consumption expenditure, quantity and quality for household h in county c of product module g at month t.
- $UE_{ct}$ : Monthly county-level unemployment rate.
- I<sub>h,l,t</sub>: Lagged (year) income quintile.
- $X_{it}$ : Controls: (yearly) employment status, lagged (monthly) shopping trips, lagged (monthly) unique stores visited.
- $\zeta_{h,g}$ : Household-Product-Module fixed-effect.
- $\eta_t$ : Time dummies.
- Standard errors clustered at the county level.

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# II. Summary Statistics – Demographics

	Income Quintile					
Variable	1st	2nd	3rd	4th	5th	All
		Yearly Averages				
Income, \$1,000	15.28	33.88	53.11	78.56	133.04	65.23
Age	50.5	48.4	47.3	48.1	48.6	48.5
HH size	2.1	2.4	2.8	2.8	2.9	2.6
All Adults Not Employed	0.4	0.1	0.1	0.1	0	0.1
One Not Employed	0.6	0.4	0.4	0.3	0.3	0.4
Monthly Unempl. (Sea. Adj.), %	8.49	8.25	8.12	7.99	7.88	8.13
No. Observations	7,939	8,360	8,817	8,852	9,555	43,523

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# II. Summary Statistics – Monthly Shopping

	Income Quintile					
Variable	1st	2nd	3rd	4th	5th	All
	Monthly Averages					
Monthly Expenditures, \$	286.89	324.06	355	371.62	402.87	350.53
No. Unique PMs Bought	39.41	43.46	46.07	46.72	45.51	44.36
No. UPCs Bought	100.98	109.02	115.14	114.53	112.15	110.6
Avg. Price per UPC, \$	3.14	3.25	3.44	3.59	3.99	3.5
Quality						
UPC Rank, %	19.3	20.27	20.91	21.46	22.08	20.86
Relative UPC price, %	-3.85	-2.01	-0.4	1.89	5.33	0.39
UPC Arbitrage (Actual Price), \$	49.68	60.34	67.8	72.01	85.67	67.85
Store Arbitrage (Actual Price), \$	85.31	101.57	117.63	129.54	155.74	119.45
Extreme (Actual Price), \$	216.21	249.16	279.86	301.5	339.41	279.84

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# II. Reduced Form Results – Monthly Expenditures

	Dependent Variables (Estimates Multiplied by 100)					
Variable	(1) Log Expenditure	(2) Log Volume	(3) Log Average Price			
Local Unemployment, $\beta_1$	-0.674***	-0.204***	-0.468***			
(Seasonally Adj.)	(0.125)	(0.061)	(0.0686)			
Income Quintile × Unemployment						
1st	0.568***	-0.0462	0.462***			
	(0.201)	(0.0798)	(0.115)			
2nd	0.0344	-0.102	0.0562			
	(0.161)	(0.0699)	(0.0975)			
3rd		—Base Level—				
4th	0.0306	0.0781	-0.0243			
	(0.125)	(0.0673)	(0.0791)			
5th	-0.035	0.126*	-0.0786			
	(0.134)	(0.0756)	(0.0771)			
Controls	Yes	Yes	Yes			
HH-Product Module FE	Yes	Yes	Yes			
Time dummies	Yes	Yes	Yes			
Million Observations	61.95	62.23	61.95			
Thousand Clusters	77.2	77.2	77.2			

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## II. Reduced Form Results – Interpretation

- A one percentage point increase in the local unemployment level is associated with 0.6 percent reduction in monthly expenditures on average.
  - 2/3 of the this reduction comes from the quality margin, and 1/3 from the quantity margin.

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(Seasonally Adj.)	(0.125)	(0.061)	(0.0686)			
Income Quintile × Unemployment						
1st	0.568***	-0.0462	0.402***			
	(0.201)	(0.0798)	(0.115)			
2nd	0.0344	-0.102	0.0562			
	(0.161)	(0.0699)	(0.0975)			
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# II. Reduced Form Results – Interpretation

- A one percentage point increase in the local unemployment level is correlated with 0.6 percent reduction in monthly expenditures on average.
  - 2/3 of the this reduction comes from the quality margin, and 1/3 from the quantity margin.
- When facing negative income shock, low income households do not appear to lower consumption quality.

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# II. Reduced Form Results – UPC Ranking

	Dependent Variables (Estimates Multiplied by 10				
	(1)	(2)			
Variable	UPC Rank	Rel. UPC Price			
Local unemployment	-0.034**	-0.153***			
(Seasonally Adj.)	(0.0159)	(0.0317)			
Income Quintile × Unemployment					
1st	0.0573***	0.198***			
	(0.0192)	(0.04)			
2nd	0.0263	0.0725**			
	(0.0166)	(0.0349)			
3rd	—Base	e Level—			
4th	-0.0368**	-0.0428			
	(0.0183)	(0.0369)			
5th	-0.0643***	-0.0397			
	(0.0202)	(0.0386)			
Controls	Yes	Yes			
HH-Product Module FE	Yes	Yes			
Time Dummies	Yes	Yes			
Million Observations	61.4	61.4			
Thousand Clusters	77.4	77.4			

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# II. Reduced Form Results – Unexploited "Arbitrage"

	Dependent Variables, Actual Price (Estimates Multiplied by 100)				
Variable	(1) UPC	(2) Store	(3) Extreme Shopping		
Local Unemployment	-0.866***	-3.1***	-5.28***		
(Seasonally Adj.)	(0.236)	(0.576)	(0.743)		
Income Quintile × Unemployment	,	,	,		
1st	0.886***	1.49*	2.7***		
	(0.289)	(0.766)	(0.955)		
2nd	0.403	0.838	0.931		
	(0.254)	(0.612)	(0.814)		
3rd	` ,	—Base Level—	-		
4th	0.164	0.711	-0.671		
	(0.221)	(0.664)	(0.801)		
5th	-0.0764	`1.55* <sup>´</sup>	0.491		
	(0.255)	(0.846)	(0.886)		
Controls	Yes	Yes	Yes		
HH-Product Module Fixed-Effects	Yes	Yes	Yes		
Time dummies	Yes	Yes	Yes		
Million Observations	62.23	62.23	62.23		
Thousand Clusters	77.2	77.2	77.2		

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# II. Reduced Form Results – Yearly Income

(Estimates Multiplied by 100)	Income		HH-PM-FE	Mio.	1,000
Dependent Variable	Estimate	Std.Err	& Controls	Obs.	Clusters
Log Expenditure Log UPCs Bought Log Avg. Price Quality	17.1*** 13.5*** 3.53***	(2.11) (2.05) (0.891)	Yes Yes Yes	28.6 28.7 28.6	76.1 76.1 76.1
UPC Rank	0.494**	(0.252)	Yes	28.7	76.1
Relative UPC price	2.5***	(0.713)	Yes	28.7	76.1
UPC (Actual Price), \$	6.26**	(2.56)	Yes	28.8	76.1
Store (Actual Price), \$	38.9***	(7.83)	Yes	28.8	76.1
Extreme (Actual Price), \$	69.9***	(9.27)	Yes	28.8	76.1

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#### II. Reduced Form Results – -Product Module Substitution

#### Estimated Partial Effects of Local Unemployment Rate Shock, by Department

		( -Al	l Estimates	Multiplied by 1	.00- )	
	Log Ex	penditures	Log Products Bought		Log Avg. Price Paid	
Department	Avg.	1st Quantile	Avg.	1st Quantile	Avg.	1st Quantile
Alcoholic Beverages	1.4	7.17***	1.44	2.81*	-0.354	1.87*
	(1.3)	(1.3155)	(1.05)	(1.4956)	(0.692)	(1.0694)
Dairy	-1.15***	-1.02***	-0.0974	0.05	-1.23***	-1.18***
	(0.164)	(0.276)	(0.15)	(0.2754)	(0.0786)	(0.1398)
Deli	-0.925**	0.15	-0.769**	-0.01	-0.615**	-0.2
	(0.383)	(0.7336)	(0.324)	(0.6486)	(0.242)	(0.4827)
Dry Grocery	-0.604***	0.05	-0.223*	-0.02	-0.238***	0.22*
	(0.123)	(0.2237)	(0.116)	(0.1935)	(0.0727)	(0.1293)
Fresh Produce	0.135	0.88	0.126	0.33	-0.314	0.23
	(0.302)	(0.5762)	(0.226)	(0.4159)	(0.205)	(0.4675)
Frozen Foods	-0.168	0.23	0.447**	0.7**	-0.157	0.6**
	(0.231)	(0.3797)	(0.221)	(0.3527)	(0.148)	(0.2625)
General Merchandise	-0.264	2.66**	0.0662	2.27**	-0.189	1.71
	(0.902)	(1.3175)	(0.609)	(0.9646)	(1)	(1.4269)
Health & Beauty Care	-0.649	-0.3	-0.229	-0.24	-0.498	-0.15
	(0.402)	(0.6387)	(0.271)	(0.4943)	(0.36)	(0.5889)
Non-food Grocery	-0.371	-0.45	-0.0854	-0.33	-0.281*	-0.38
	(0.234)	(0.619)	(0.193)	(0.3996)	(0.165)	(0.2991)
Packaged Meat	-0.268	-0.12	-0.145	-0.16	-0.619***	-0.1
	(0.294)	(0.4736)	(0.254)	(0.4526)	(0.229)	(0.3491)

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# II. Stylized Facts

- When facing negative income shock, households lower their monthly consumption expenditure by reducing both the *quality* and *quantity* of the products purchased.
  - Households engage in both intra-product module switching and inter-product module switching.
- ② Low-income households *do not* downgrade the quality of the products purchased, while they still reduce their consumption quantities.
  - They face quality constraints.

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# II. Stylized Facts $\Rightarrow$ Theoretical Framework – Key Features

- Non-homotheticities of quality and quantity.
  - Allow substitution between UPCs within product module.
  - Allow substitution across product modules.
- Quality constraints.

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# II. Theoretical Framework – Limitations in Existing Literature

- Standard framework assumes UPC choice is binary choice:
  - Quality-quantity choice is homothetic
    - No substitution between UPCs within Product Module: agent picks (one and only)  $u^* = \arg_u \max\{Q_u \cdot M/p_u\}$
    - From above:  $u^*$  is independent of M
    - Budget shares across Product Module are constant wrt income.
  - No constraints on quality
- Common approach: Assume preference for quality changes with income. (Handbury 2015; Redding and Weinstein 2016, Faber and Fally 2016)
  - $\Rightarrow$  Agent picks  $u^* = \arg_u \max\{Q_u(I) \cdot M/p_u\}$
  - UPC choice now varies with income (and budget).
  - Challenge: Cannot address welfare costs of income fluctuations since stable preference over time and across income groups is required.

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#### Outline

- Defining and Calculating Quality
- 2 Empirical Analysis
- **1 Theory and Welfare Analysis**

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# IV. Theory - Standard Utility Aggregation

**Utility Function**: Agent maximizes utility by choosing the consumption bundle of quantity,  $C_j$ , and quality,  $Q_j$ , across all product modules, j.

$$U(\mathbb{C},\mathbb{Q}) = \left(\sum_{j} v_{j} u_{j}(C_{j}, Q_{j})^{\frac{\sigma-1}{\sigma}}\right)^{\frac{\sigma}{\sigma-1}}, \quad v_{j} \geq 0,$$
 (5)

- $v_i$ : product module share.
- $\sigma(>1)$ : elasticity of substitution between product modules.

#### **Budget Constraint**

$$\sum_{i} C_{j} \cdot P(Q_{j}) \leq M. \tag{6}$$

M: total expenditure/budget .

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# IV. Theory – Power-Log Sub Utility

$$u_j(C_j, Q_j) = \ln(C_j)^{\alpha_j} + \ln(Q_j)^{\beta_j}. \tag{7}$$

- $\alpha$ : preference for quantity of pm j.
- $\beta$ : preference for quality of pm i.
- *Non-homothetic* for (almost) all values of  $\alpha \neq \beta$ .
- With non-homothetic utility and if the elasticity of the price is non-unit value,  $\varepsilon_{P|Q} \neq 1$ , then the demand for quality (and quantity) is a non-linear function of income.

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## IV. Theory - Price

#### **Price Relation**

$$P(Q) = \eta Q^{\gamma_j}. \tag{8}$$

- ullet  $\eta$ : normalizing factor
- $\gamma_j$ : Price Elasticity wrt. Quality =  $\varepsilon_{P|Q} \equiv \frac{P(Q)}{Q} \frac{\partial P(Q)}{\partial Q}$

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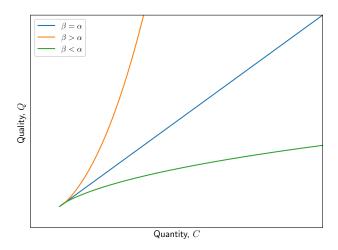
# IV. Theory – Optimal Relation between Quantity and Quality

$$\ln(Q_j)^{1-\beta_j} = \frac{\beta_j}{\alpha_j \gamma_j} \ln(C_j)^{1-\alpha_j}.$$
 (9)

- For  $\alpha \neq \beta$  and  $\gamma \neq 1$  then the optimal relationship between quantity, C, and quality, Q, is non-linear
- For  $\beta > \alpha$ : Quality increase *faster* than quantity
- For  $\beta = \alpha$  and  $\gamma < 1$ : Quality increase faster than quantity
- For  $\beta = \alpha$  and  $\gamma > 1$ : Quality increase *slower* than quantity

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## IV. Theory – Quantity Quality Trade Off



Relationship between optimal choice of quantity and quality for hypothetical preferences and  $\gamma=1$ , based on the optimality condition (9).

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## IV. Theory – Structural Estimation

#### **Estimating Utility Parameters**

$$\ln \tilde{Q}_j = \theta_0^j + \theta_1^j \ln \tilde{C}_j + \varepsilon_j. \tag{10}$$

where  $\tilde{Q}_j = \ln Q_j$  and  $\tilde{C}_j = \ln C_j$ .

#### **Estimating Price Parameters**

$$\ln P(Q_j) = \ln \eta_j + \ln \eta_t + \gamma_j \ln Q_j + \epsilon_j. \tag{11}$$

#### **Dealing With Endogeneity**

- Instrumenting  $Q_i$  with lagged total expenditure and lagged income.
- Household fixed-effects.
- Interior solution: Use only HHs with income > median.

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# IV. Theory – Structural Estimation (cont') (dropping subscript j)

#### **Estimating Preference Parameters**

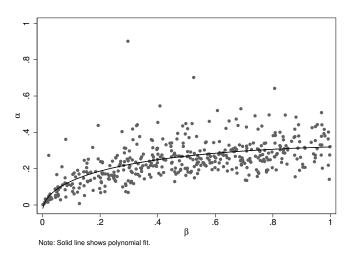
- Obtain estimates for  $\theta_0, \theta_1$  and  $\gamma$  from regression models (10) and (11) above.
- ② Then solve for  $\alpha$  and  $\beta$  in the equation system below.
- In general, there can be multiple solutions, we pick the solutions obeying fundamental utility assumptions.

$$\hat{\theta}_0 = \frac{1}{1-\beta} \left( \ln(\beta/\alpha) - \ln(\hat{\gamma}) \right), \tag{12}$$

$$\hat{\theta}_1 = \frac{1 - \alpha}{1 - \beta}.\tag{13}$$

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# IV. Theory – Plotting Utility Parameters



Scatter of Estimated Quantity Parameters,  $\alpha$ , and Quality Parameters,  $\beta$ .

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## IV. Theory - Optimal Quality and Expenditure

$$\ln(X) = \ln(C) + \ln(P(Q))$$

$$= \left(\frac{\alpha\gamma}{\beta}\right)^{\frac{1}{1-\alpha}} \left(\ln(Q)\right)^{\frac{1-\beta}{1-\alpha}} + \eta + \gamma \cdot \ln(Q)$$
(14)

- ullet Non-linear relationship between quality, Q, and PM expenditure, X.
- No closed form solution; perform numerical search.

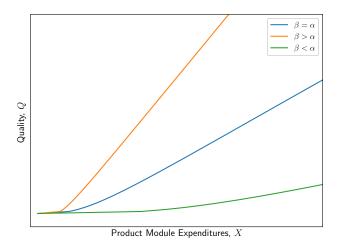
#### Optimal Quality as a Function of PM Expenditures

$$ln(Q) = \Gamma(X),$$
(15)

where  $\Gamma(\cdot)$  represents the solution to  $\ln(Q)$  in (14).

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# IV. Theory – Optimal Quality and Expenditure (cont.)



Relationship between optimal choice of quality as a function of product module expenditures, based on equation (14).

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### IV. Theory - Sub-utility and Expenditure

Sub-Utility as a Function of PM expenditures, X

$$u(X) = \left(\frac{\alpha\gamma}{\beta}\right)^{\frac{\alpha}{1-\alpha}} \ln(Q(X))^{\alpha\frac{1-\beta}{1-\alpha}} + \ln(Q(X))^{\beta}$$
$$= \Omega\Gamma(X)^{\psi} + \Gamma(X)^{\beta}. \tag{16}$$

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# IV. Theory - Aggregating Utility

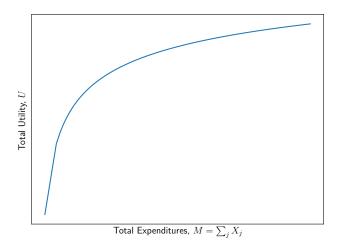
• Applying the standard sub-utility aggregation approach shows the well-known *super*-utility as a direct function of total expenditures,  $M = \sum_i X_i$ .

$$\tilde{U}(M) = \left(\sum_{j} \tilde{v}_{j} u(X_{j})^{\frac{\sigma-1}{\sigma}}\right)^{\frac{\sigma}{\sigma-1}}.$$
(17)

- Utility is a concave function of total expenditures.
- Recall that, for almost any  $\alpha_j$  and  $\beta_j$ , this utility function is non-homothetic in its inputs, C and Q, and therefore in total expenditures M.
- Thus, budget shares are non-linear, leading to non-linear Engel curves.

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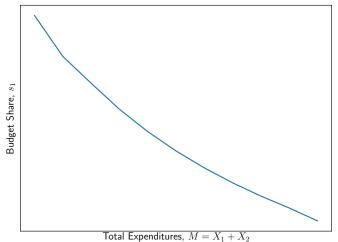
# IV. Theory – Graphing the Utility Function



Relationship between utility and total budget based on equation (17).

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### IV. Theory - Illustrating Budget Shares, Two-PM Case



Budget share,  $s_1$  calculated as  $X_1/M$ , where  $\alpha_1 < \alpha_2$ ,  $\beta_1 < \beta_2$ , and all other parameters are identical.

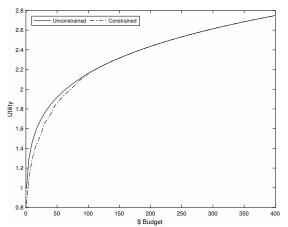
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# VI. Welfare Analysis

- Quality constraints
  - Utility maximization problem is now a constrained optimization problem
    - Impose lower bound on quality, Q
  - We solve the agent's utility maximizing problem numerically
- Welfare calculations
  - Equivalent variation: \$ value of difference between utility in constrained vs. unconstrained environment.
  - Compensating variation: \$ compensation for not being quality constrained.

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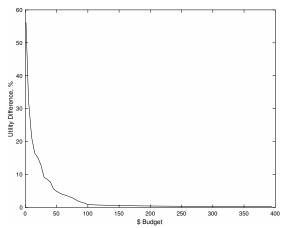
#### Unconstrained vs. Constrained Optimal Utility



Unconstrained versus Constrained Optimal Utility as a Function of Monthly Budget. Notes: Let U and V be unconstrained and constrained optimal utility, respectively, then the lines plots U(M)/U(M=1) and V(M)/U(M=1).

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## Utility Gains from Being Unconstrained

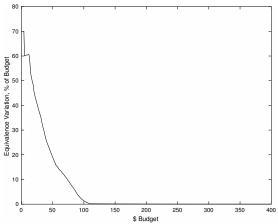


Relative Difference (%) in Unconstrained and Constrained Optimal Utility as a Function of Monthly Budget.

Notes: Let U and V be unconstrained and constrained optimal utility, respectively, then the line plots (U-V)/V \* 100.

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#### **Equivalent Variation**



% dollar compensation required to balance constrained and unconstrained optimal utility.

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### VI. (Lucas-style) Welfare Calculations (work in progress)

• To address welfare costs from income fluctuations, we calculate the Lucas welfare gain,  $\lambda^*$ , of eliminating consumption fluctuations

$$\lambda^* \equiv \arg_{\lambda} : \sum_{t=0}^{T} \beta^t E \Big[ \tilde{U} \big( (1+\lambda) M_t \big) \Big] = \sum_{t=0}^{T} \beta^t \tilde{U} \big( A e^{\mu t} \big), \qquad (18)$$
$$M_t = A e^{\mu t} e^{-(1/2)\sigma^2} \varepsilon_t.$$

#### Where

- $\tilde{U}(M_t)$  is the period utility function from expenditures in equation (17),
- ullet eta is the (constant) inter-temporal discount factor,
- $\log(\varepsilon_t) \sim i.i.N(0, \sigma^2)$ ,
- $E[e^{-(1/2)\sigma^2}\varepsilon_t] = 1$ ,
- $E[M_t] = Ae^{\mu t}$ .

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### Summary

- Quantified the *quality* channel for consumption smoothing in response to income shocks.
  - Households decrease their monthly consumption expenditure by reducing both the *quantity* and *quality* of the products purchased on average.
  - ② Low-income households do not downgrade the quality of the products purchased, while they still reduce their consumption quantities.
    - ⇒ Lower income households are facing *quality constraints*
- Developed a tractable model
  - Non-homotheticities of the quantity-quality choice: agents value both the quality and quantity margins of household consumption.
  - Study consequences of income shocks on household welfare through both margin of adjustments.

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Thank you!

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