Challenging the CES assumption with scanner data-pitfalls of the fixed basket

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What is this about?

- Established methodology –recommended and used
- A rather new data source rendering insights (novel?)
- Some supportive theory backing up the methodology
- An empirical study on scanner data
- Some ideas to take home and to think through?



The Constant Elasticity of Substitution assumption (1)

Elasticity of Substitution

- The simplified situation of consumers discriminating between obviously substitutable items as a response to price changes (substitution in "narrow sense", de Haan (2001))
 Reminisces the ex post Laspeyres v.s. Paasche discussion
- Elasticity of substitution is a <u>concept</u> of what-for-what: how many green apples for red apples, given a change in relative prices
- In practically all cases, it is a parameter of non-negative magnitude (≥0)



The Constant Elasticity of Substitution assumption (2)

Assuming a constant elasticity means that...

- ...substitution is thought to be equal for <u>all</u> pairs of items in some aggregate under consideration and hence, in <u>all</u> possible baskets
- ...there is a time invariance concept

And it implies that...

- …the universe of items is "closed under sampling" (Laspeyres ⇔ Paasche)
- ...sampling is a valid approach for including items (randomness is amical)
- ...homothetic preferences income levels do not affect choices (timing not an issue)



Estimating the elasticity of substitution

• Balk (1999) derives an expression from which estimation boils down to the application of some numerical procedure, for a basket with n items (c.f. §17.61 in the manual: the Lloyd-Moulton index):

$$\left[\sum_{i=1}^{n} s_{i}^{0} \binom{p_{i}^{t}}{p_{i}^{0}}^{(1-\sigma)}\right]^{1/(1-\sigma)} = \left[\sum_{i=1}^{n} s_{i}^{t} \binom{p_{i}^{t}}{p_{i}^{0}}^{-(1-\sigma)}\right]^{-1/(1-\sigma)}$$

• There is perhaps an asynchrony in general, as pointed out by Shapiro & Wilcox (1997):

"The mismatch in frequency between the price and expenditure data creates an ambiguity as to how one might best approximate the index formulas prescribed by theory"



A sample of items deemed suitable for analysis

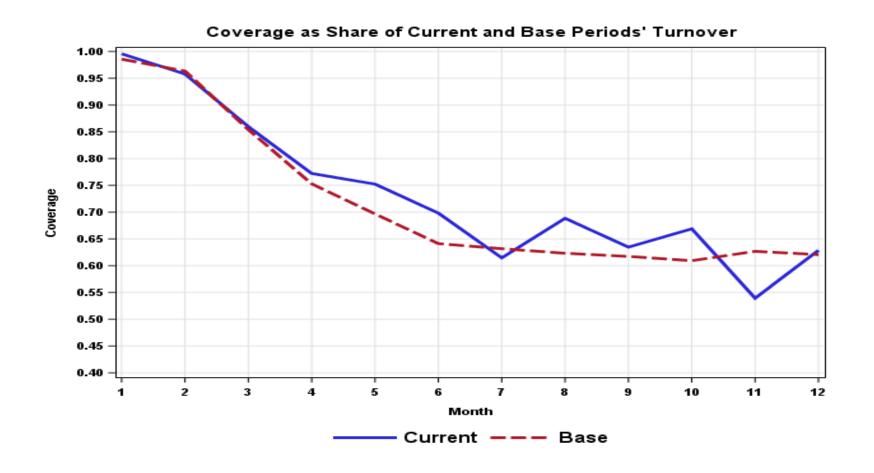
The following set of multi-brand products were analyzed:

- 1) Sugar free soda beverage, 1.5 Liter (2 varieties, pps-sampled)
- 2) Dairy product, 1 Liter (2 varieties, pps-sampled)
- 3) Coffee, 450-500 grams, grounded (<u>all</u> varieties = census)
- 4) Cheese, packaged, several similar varieties (n most sold varieties, cut-off-sample)

Coverage well*, representativeness well*, by-the-book approach



Two ways of looking at coverage





Coverage for coffee during one year, as used for analysis

How the data was used to render necessary input to the estimation

- The scanner data is weekly turnover and amount of units sold per item (identified through EAN/GTIN) and per store
- Data is aggregated over weeks to a monthly turnover per store and included if it has a match with the base period for the same store (= balance)
- Estimations are through "item aggregation over stores", rendering one aggregate monthly price and expenditure share (summing to unity) per item



Summary statistics on estimates of σ

| Product | #estimates | Mean | Median | Std. dev. | Share σ <0 |
|---------|------------|------|--------|-----------|-------------------|
| Soda | 144 | 3.6 | 2.05 | 10.35 | 22% |
| Dairy | 72 | 9.68 | 1.34 | 63.1 | 44% |
| Coffee | 36 | 2.56 | 2.92 | 2.03 | 11% |
| Cheese | 42 | 4.21 | 4.05 | 1.41 | - |



Note: column with #estimates refers to number of estimated σ over all time points and included retail chains (one estimate per retail chain and period)

A comparison of four price indices

Laspeyres, Paasche and Lloyd (σ = median), as per cent deviation from unweighted (standard) Jevons

| Soda σ = 2.05 | | Dairy $\sigma = 1.34$ | | Coffee | Coffee σ = 2.92 | | Cheese σ = 4.05 | | | | | |
|-----------------------------|-------|-----------------------|-------|--------|------------------------|-------|------------------------|-------|-------|-------|-------|-------|
| Period | Lasp. | Paas. | Lloyd | Lasp. | Paas. | Lloyd | Lasp. | Paas. | Lloyd | Lasp. | Paas. | Lloyd |
| 1 | 2.5 | 2.7 | 2.2 | -0.2 | -0.2 | -0.1 | 12.7 | 6.9 | 10.4 | -2.4 | -9.9 | -6.3 |
| 2 | 2.5 | 2.6 | 2.3 | 0.5 | 0.5 | 0.6 | 12.4 | 6.4 | 10.1 | -0.3 | -6.6 | -3.5 |
| 3 | 5.6 | 6.2 | 4.8 | -1.7 | -1.6 | -1.9 | 12.5 | 9.8 | 10.8 | -4.4 | -7.3 | -6.6 |
| 4 | 3.8 | 4.3 | 3.1 | -5.4 | -5.3 | -5.4 | 6.0 | 4.6 | 4.8 | -3.8 | -9.3 | -7.2 |
| 5 | 6.4 | 8.0 | 4.2 | -5.8 | -5.7 | -5.8 | 11.2 | 8.5 | 9.5 | -3.5 | -10.0 | -7.6 |
| 6 | 11.4 | 16.0 | 7.8 | -5.4 | <i>-5.4</i> | -5.4 | 7.5 | 3.7 | 5.9 | -3.2 | -6.4 | -5.0 |
| 7 | 5.8 | 8.1 | 2.9 | -5.9 | -5.9 | -5.9 | 14.3 | 9.6 | 11.8 | -3.0 | -8.0 | -5.8 |
| 8 | 5.9 | 8.1 | 3.3 | -3.2 | -3.1 | -3.5 | 10.8 | 6.6 | 8.8 | -2.1 | -8.0 | -5.4 |
| 9 | 0.1 | 0.3 | -0.2 | -5.7 | -5.7 | -5.7 | 16.0 | 9.3 | 12.8 | -3.1 | -9.3 | -7.0 |
| 10 | 6.2 | 8.7 | 3.6 | -8.2 | -8.2 | -8.4 | 14.7 | 10.2 | 11.9 | -3.3 | -9.3 | -6.5 |
| 11 | 1.7 | 2.3 | 1.2 | -10.6 | -10.6 | -10.8 | 17.0 | 10.0 | 13.6 | 0.2 | -5.4 | -2.0 |
| 12 | -0.2 | -0.2 | -0.3 | -9.6 | -9.5 | -9.9 | 5.7 | 3.6 | 3.9 | -0.9 | -5.6 | -3.0 |



Remarks on estimating σ

• After some consideration, one understands the following conclusion by Henningsen & Henningsen (2012) regarding CES estimation:

"is generally considered problematic due to convergence problems and unstable and/or meaningless results"

• Remember that the limited sample based estimates were questionable to a large extent (σ <0)



Inference should be made carefully – results indicative rather than conclusive!

A fixed basket in a changing universe – realistic?

- This is actually two questions:
 - 1) a fixed and limited sample based basket, and
 - 2) a fixed census-like/take-all sample based basket (with the caveat of time *)
- Regardless of the results here, the validity of a limited sample can be discussed when measuring effective prices rather than list prices (offer/over-the-counter)
 - (*) The universe of available items is changing
 - The problem in estimations also stems from temporary consumption changes due to price campaigns (or perhaps random effects)



Thank you for your attention!

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