

Dossche, Maarten; Heylen, Freddy; Van den Poel, Dirk

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The kinked demand curve and price rigidity: evidence from scanner data

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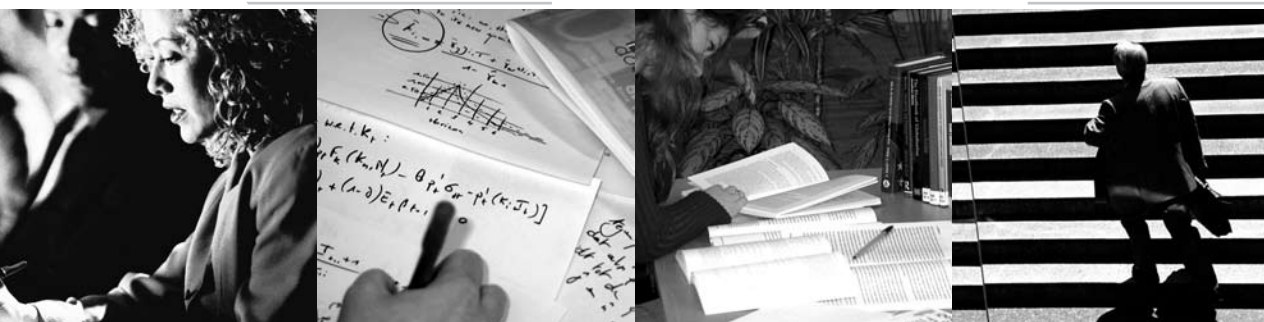
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The kinked demand curve and price rigidity: evidence from scanner data

Maarten Dossche Freddy Heylen Dirk Van den Poel



NATIONAL BANK OF BELGIUM

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THE KINKED DEMAND CURVE AND PRICE RIGIDITY: EVIDENCE FROM SCANNER DATA

Maarten Dossche (*)
Freddy Heylen (**)
Dirk Van den Poel (***)

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(*) Corresponding author - NBB, Research Department (e-mail: maarten.dossche@nbb.be), SHERPPA, Ghent University, <http://www.sherppa.be>

(**) SHERPPA, Ghent University (e-mail: freddy.heylen@UGent.be), <http://www.sherppa.be>

(***) Marketing Department, Ghent University (e-mail: dirk.vandenpoel@UGent.be), <http://www.crm.ugent.be>

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Editorial

On October 12-13, 2006 the National Bank of Belgium hosted a Conference on "*Price and Wage Rigidities in an Open Economy*". Papers presented at this conference are made available to a broader audience in the NBB Working Paper Series (www.nbb.be).

The views expressed in this paper are those of the authors and do not necessarily reflect the views of the National Bank of Belgium.

Abstract

This paper uses scanner data from a large euro area retailer. We extend Deaton and Muellbauer's Almost Ideal Demand System to estimate the price elasticity and curvature of demand for a wide range of products. Our results support the introduction of a kinked (concave) demand curve in general equilibrium macro models. We find that the price elasticity of demand is on average higher for price increases than for price decreases. However, the degree of curvature in demand is much lower than is currently imposed. Moreover, for a significant fraction of products we observe a convex demand curve. We find no correlation between the estimated price elasticity/curvature and the observed size or frequency of price adjustment in our data.

JEL-code : C33, D12, E3

Keywords: price setting, real rigidity, kinked demand curve, behavioral AIDS.

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1 Introduction

A large literature documents the persistent effects of monetary policy on real output and inflation (Christiano et al., 1999, 2005; Peersman, 2004). Given the key role of price rigidity to explain this persistence, micro-based models of price setting have been developed for macro models. A first approach has been to introduce frictions to nominal price adjustment (e.g. Taylor, 1980; Calvo, 1983; Mankiw, 1985). However, as shown by several authors, the real effects of nominal frictions do not last much longer than the average duration of a price (Chari et al., 2000; Bergin and Feenstra, 2000). The role of nominal price frictions has also been challenged by recent microeconomic evidence showing that the mean price duration in the United States is only about 1.8 quarters (Bils and Klenow, 2004), while in the euro area it is only 4 to 5 quarters (Dhyne et al., 2006).

The failure of nominal frictions alone to generate sizeable persistence has led to the development of models which combine nominal and real price rigidities (Ball and Romer, 1990). Real rigidities refer to a firm's reluctance to adjust its price in response to changes in economic activity if other firms do not change their prices. Either supply side or demand side factors can explain this reluctance to carry out significant price changes. Blanchard and Galí (2006), among others, obtain real rigidities from the supply side by modelling rigid real wages. Bergin and Feenstra (2000) adopt the production structure proposed by Basu (1995). Real price rigidity follows from the assumption that firms use the output of all other firms as materials in their own production. Many other authors point to firm-specific factors of production (e.g. Galí and Gertler, 1999; Sbordone, 2002; Woodford, 2003; Altig et al., 2005). Although these supply side assumptions generally raise the capacity of calibrated models to match the data, they never are completely convincing. The stylized fact that real wages are procyclical may be a problem for models emphasizing wage rigidity. Prices seem to change even less than wages in response to changes in economic activity (Rotemberg and Woodford, 1999). Models putting firm-specific

factors of production at the center only seem to match the micro evidence on price adjustment by assuming either an unrealistically steep marginal cost curve or an unrealistically high price elasticity of demand.¹ Bergin and Feenstra (2000) do not need unrealistic price elasticities. However, their model performs best when they also introduce Kimball (1995) preferences which imply a concave demand curve.

The specification of Kimball preferences has become the most successful way to obtain real price rigidity from the demand side in recent research.² In contrast to the traditional Dixit and Stiglitz (1977) approach, Kimball (1995) no longer assumes a constant elasticity of substitution in demand. The price elasticity of demand becomes a function of relative prices. A key concept is the so-called curvature, which measures the price elasticity of the price elasticity. When the curvature is positive, Kimball preferences generate a concave or smoothed "kinked" demand curve in a log price/log quantity framework. This creates real price rigidity. Intuitively, assume an increase in aggregate demand which raises a firm's marginal cost due to higher wages. If the firm were free to change its price, it would raise it. However, if a price above the level of its competitors strongly increases the elasticity of demand for the firm's product, the firm can lose profits from strong price changes. Inversely, in the case of a fall in marginal cost, a reduction in the firm's price would strongly reduce the elasticity of demand. Again the firm would lose profits from drastic price changes. Price rigidity is a rational choice.

Despite its attractiveness, the literature suffers from a remarkable lack of empirical evidence on the existence of the kinked (concave) demand curve and on the size of its curvature. In Appendix 1 we report the parameter values for the price elasticity of demand and for the curvature, both at steady state, as imposed in recent model calibrations. Values for the (positive)

¹For example Altig et al. (2005) require a (positive) price elasticity of demand above 20 for their model to match the micro evidence on price adjustment. Most of the empirical studies, however, reveal much lower elasticities. Bijmolt et al. (2005) present a meta-analysis of the price elasticity of demand. Across a set of 1851 estimated price elasticities based on 81 studies, the median (positive) price elasticity is 2.2. The empirical evidence that we will report in this paper confirms that the price elasticity of demand is much lower than the elasticity required by Altig et al. (2005).

²See e.g. Bergin and Feenstra (2000), Coenen and Levin (2004), Eichenbaum and Fisher (2004), de Walque, Smets and Wouters (2005), Dotsey and King (2005), Dotsey, King and Wolman (2006), Klenow and Willis (2006).

price elasticity range from 3 to 20, values for the curvature range from less than 2 to more than 400. This lack of reliable evidence may undermine an appropriate assessment of the true power of the kinked demand curve as a relevant real rigidity.

Our contribution in this paper is twofold. First, we test the theory of the kinked (concave) demand curve. We investigate whether the price elasticity of demand does indeed rise in the relative price. Our second contribution is to estimate this price elasticity and especially the curvature of the demand curve. Our results should be able to reduce the uncertainty in the literature surrounding these parameters. To do this, we need data on both prices and quantities. We use a scanner dataset from a large euro area retailer. The strength of this dataset is that it contains information about prices and quantities sold of about 15,000 items in 2002-2005.³ Section 2 of the paper describes the dataset in greater detail. We also analyze key properties of the data like the size and frequency of price changes, the correlation between price and quantity changes as one indicator for the importance of demand versus supply shocks, the (a)symmetry in the observed price elasticity of demand for price increases versus decreases, etc. Section 3 of the paper presents a much more rigorous econometric analysis of price elasticities and curvature parameters for individual items. To that end we extend the Almost Ideal Demand System (AIDS) of Deaton and Muellbauer (1980a). We follow Hausman (1997), using a panel data model, to estimate our demand system. Section 4 concludes the paper.

Our main results are as follows. First, we find wide variation in the estimated price elasticity and the curvature of demand among items/product categories. Although demand for the median item is concave, the fraction of items showing convex demand is significant. Second, our results strongly support the introduction of a kinked (concave) demand curve in general equilibrium macro models. However, the degree of curvature is much lower than is currently imposed. Our suggestion would be to impose a curvature parameter around 4. Third, we find no correlation between the estimated price elasticity/curvature and the observed size or frequency of price

³Note that the *items* that are sold by our retailer can be differently packaged goods of the same *brand*. All items and/or brands in turn belong to a particular *product category* (e.g. potatoes, detergent).

adjustment in our data. Our specific context of a multi-product retailer may explain this lack of correlation.

2 Basic Facts about the Data

2.1 Description of Dataset

We use scanner data for a sample of six outlets of an anonymous large euro area supermarket chain. This retailer carries a very broad assortment of about 15,000 different items (stockkeeping units). The products in the total dataset correspond to approximately 40% of the euro area CPI. The data that we use in this paper are prices and total quantities sold per outlet of 2274 individual items belonging to 58 randomly selected product categories. Appendix 2 describes these categories and the number of items in each product category. The time span of our data runs from January 2002 to April 2005. Observations are bi-weekly. Prices are constant during each period of two weeks. They are the same in each of the six outlets. The quantities are the number of packages of an item that are sold during a time period.

2.2 Nominal Price Adjustment

The nominal price friction in our dataset is that prices are predetermined for periods of at least two weeks. If they are changed at the beginning of a period of two weeks, they are not changed again before the beginning of the next period of two weeks, irrespective of demand. A second characteristic of our data is the high frequency of temporary price markdowns. We define the latter as any sequence of three, two or one price(s) that is below both the most left adjacent price and the most right adjacent price.⁴ The median item is marked down for 8% of the time, whereas 27% of the median item's output is sold at times of price markdowns. In line with the previous, price markdowns are valid for an entire period, and not just for a few days.

Using the prices in the dataset, we can estimate the size of price adjustment, the frequency of price adjustment and median price duration as has been done in Bills and Klenow (2004) and

⁴This definition puts us in between Klenow and Kryvtsov (2005) and Midrigan (2006).

Dhyne et al. (2006). Table 1 contains these statistics. The total number of items involved is 2274. Note that due to entry or exit we do not observe data for all items in all periods. Moreover, for the statistical analysis in Section 2 we have excluded items when they are mentioned in the supermarket's circular.⁵

We calculate price adjustment statistics including and excluding temporary price markdowns. When an observed price is a markdown price, we replace it by the last observed regular price (see also Klenow and Kryvtsov, 2005). We illustrate our procedure in Appendix 3.

Conditional on price changes taking place and including markdowns, we see in Table 1 that 25% of the items have an absolute average price change of less than 5%. At the other end, 25% have an absolute average price change of more than 17%. The median item has an absolute average price change of 9%. Filtering out markdowns, the latter falls to 5%. The size of price changes in our dataset is slightly smaller than is typically observed in the US.⁶ This is a first important finding. Assuming realistic idiosyncratic shocks, large price changes would not be consistent with a real price rigidity such as a Kimball-type demand curve (Klenow and Willis, 2006). As to price duration, the median item's price lasts 0.9 quarters when we include markdown periods. It lasts 6.6 quarters excluding markdown periods. Price duration in our data is longer than is typically observed in the US.⁷

In Section 3.3. we will check whether the results on the elasticity and curvature of the demand curve are related with item specific frequencies and sizes of price change.

⁵Items that are mentioned in the circular are often sold at lower price. This may bias our analysis of the importance of supply versus demand shocks in Table 2 in favor of supply shock dominance (high quantity sold, low price). It may also imply an upward bias in the estimate of the (positive) downward price elasticity in Table 3.

⁶Excluding markdowns, Klenow and Kryvtsov (2005) report a mean absolute price change of 8%. In our data the mean price change excluding markdowns is 7%.

⁷Bils and Klenow (2004) report a median price duration of about 1.1 quarter in US data. The rise in their median duration to about 1.4 quarters when temporary markdowns are netted out is much smaller than in our data, confirming stylized facts on price rigidity in the euro area versus the US. Furthermore, note that the median price duration including markdowns in our data is shorter than the 2.6 quarters for the euro area reported by Dhyne et al. (2006). Clearly, this may be related to supermarket prices being more flexible than prices in other outlets, e.g. corner shops.

Table 1: Nominal Price Adjustment Statistics

| Percentile | Incl. markdowns | | | Excl. markdowns | | |
|--|-----------------|-----|-----|-----------------|-----|----------|
| | 25% | 50% | 75% | 25% | 50% | 75% |
| Average Absolute Size | 5% | 9% | 17% | 3% | 5% | 8% |
| Implied Median Price Duration (quarters) | 0.4 | 0.9 | 2.8 | 2.4 | 6.6 | ∞ |

Note: The statistics reported in this table are based on bi-weekly price data for 2274 items belonging to 58 product categories from January 2002 to April 2005. The data show the average absolute percentage price change (conditional on a price change taking place) and the median price duration of the items at the 25th, 50th and 75th percentile, ordered from low to high.

2.3 Real Price and Quantity Adjustment

Importance of Demand and Supply Shocks

Table 2 presents summary statistics on real (relative) price and quantity changes over the six outlets in our dataset. Individual nominal item prices p_{it} are common across the outlets. All the other data are different per outlet. Real item prices p_{it}/P_t^* have been calculated by deflating the nominal price of item i by the outlet-specific Stone price index P_t^* for the product category to which the item belongs.⁸ Algebraically, the Stone index is calculated as

$$\ln P_t^* = \sum_{i=1}^N s_{it} \ln p_{it} \quad (1)$$

with $s_{it} = \frac{p_{it}q_{it}}{X_t}$ the outlet-specific share of item i in total nominal expenditures X_t on the product category to which i belongs, q_{it} the total quantity of item i sold at the outlet and $X_t = \sum_{i=1}^N p_{it}q_{it}$. Total real expenditures Q_t have been obtained as $Q_t = X_t/P_t^*$. Real (relative) quantities show much higher and much more variable percentage changes than real prices. Including markdowns, the average absolute percentage change in relative quantity equals 59% for the median item, with a standard deviation of 77%. The average absolute percentage price change for the median item equals only 9%, with a standard deviation of 12%.⁹

The underlying individual goods data also allow for a first explorative analysis of the importance of supply and demand shocks. To that aim we first calculate simple correlations per

⁸Measuring real prices is not simple since assumptions have to be made on the 'aggregate' price index and thus on consumer preferences. The latter is especially true for items that represent a very large share in the consumption basket. As an alternative to the Stone index we have also worked with the Fisher index. The results based on this price index are reported in Appendix 4. They confirm our main findings here.

⁹For a proper interpretation, note that the median item can be different in each row of Table 2.

item and per outlet between the change in real (relative) item prices and the change in relative quantities sold. In case demand shocks dominate supply shocks, we should mainly find positive correlations between items' price and quantity changes. In case supply shocks are dominant, we should observe negative correlations. Next we split up the calculated variance in individual items' real price and quantity changes into a fraction due to supply shocks and a fraction due to demand shocks. The bottom rows of Table 2 show the fractions due to supply shocks. Concentrating on price changes, this fraction has been computed as

$$\% \text{ Supply shocks to } \Delta \ln(p_{it}/P_t^*) = \frac{\sum_{t=1,SS}^T (\Delta \ln(p_{it}/P_t^*) - \pi_i)^2}{\sum_{t=1}^T (\Delta \ln(p_{it}/P_t^*) - \pi_i)^2} * 100$$

where π_i is the mean of $\Delta \ln(p_{it}/P_t^*)$ over all periods t . The numerator of this ratio includes only observations where price and accompanying quantity changes in t have the opposite sign, revealing a supply shock (SS). The denominator includes all observations. The fraction of the variance in real price changes due to demand shocks, can be calculated as 1 minus the fraction due to supply shocks. Our results reveal that price and quantity changes are mainly driven by supply shocks. Including all data, the median item shows a clearly negative correlation between price and quantity changes equal to -0.23. Moreover, about 65% of the variance in price and quantity changes seems to follow from supply shocks.

The right part of Table 2 presents results obtained from data excluding markdown periods. Temporary price markdowns are interesting supply shocks to identify a possibly kinked demand curve, but we do not consider them as representing idiosyncratic supply shocks such as shifts in costs or technology.¹⁰ We have therefore filtered them out to gauge the importance of idiosyncratic demand and supply shocks for markets where temporary price markdowns are rare. As can be seen, the results at the right hand side of the table are fully in line with those at the left hand side.

¹⁰Note that we only exclude the item whose price is marked down, while keeping the other items. The effects of the (excluded) marked down item on the other items are thus not filtered out. If we excluded all items in periods where at least one item in the product category is marked down, we would be left with almost no observations.

Table 2: Importance of Demand and Supply Shocks

| Percentile | Including markdowns | | | Excl. markdowns | | |
|--|---------------------|-------|------|-----------------|-------|------|
| | 25% | 50% | 75% | 25% | 50% | 75% |
| Average absolute $\Delta \ln(p_{it}/P_t^*)$ | 6% | 9% | 15% | 5% | 8% | 15% |
| Average absolute $\Delta \ln(q_{it}/Q_t)$ | 39% | 59% | 80% | 38% | 59% | 79% |
| Standard Deviation $\Delta \ln(p_{it}/P_t^*)$ | 7% | 12% | 21% | 7% | 12% | 21% |
| Standard Deviation $\Delta \ln(q_{it}/Q_t)$ | 52% | 77% | 102% | 51% | 77% | 101% |
| Correlation ($\Delta \ln(p_{it}/P_t^*); \Delta \ln(q_{it}/Q_t)$) | -0.49 | -0.23 | 0.02 | -0.50 | -0.24 | 0.01 |
| % Supply Shocks to $\Delta \ln(p_{it}/P_t^*)$ ^(a) | 48% | 68% | 86% | 48% | 69% | 87% |
| % Supply Shocks to $\Delta \ln(q_{it}/Q_t)$ ^(a) | 45% | 64% | 81% | 45% | 64% | 82% |

Note: The statistics reported in this table are based on bi-weekly data for 2274 items belonging to 58 product categories in six outlets. Individual nominal item prices (p_i) are common across the outlets, all the other data (P^*, q_i, Q) can be different per outlet. (a) The contribution of demand shocks to price and quantity variability equals 1 minus the contribution of supply shocks. Computation methods are described in the main text.

An analysis of the relative importance of supply versus demand shocks is important for more than one reason. First, this is important to know in order to do a proper econometric demand analysis. One needs enough variation in supply to be able to identify a demand curve. Our results in Table 2 are obviously encouraging in this respect. The minor contribution of demand shocks should not be surprising given that prices are being set in advance or in the very beginning of the period. As long as the supplier¹¹ does not know demand in advance, demand shocks cannot have an effect on prices.¹² Second, the results of a decomposition of the variance of price changes into fractions due to demand and supply shocks may be important for a proper calibration of theoretical macro models. In order to explain large price changes, a number of authors have introduced idiosyncratic shocks in their models, affecting prices and quantities (Golosov and Lucas, 2003; Dotsey, King and Wolman, 2006; Klenow and Willis, 2006). As Klenow and Willis (2006) point out, there is not much empirical evidence available that tells us whether these idiosyncratic shocks are mainly supply-driven or demand-driven. Evidence like ours on the importance of demand and supply shocks *excluding* markdowns, as

¹¹When we use the concept 'supplier' we mean the retailer and the producer together. Usually prices in the retail sector are set in an agreement between the retailer and the producer, so that there is not one easily identifiable party that sets prices.

¹²Of course, one could argue that the supplier does know in advance that demand will be high or low, so that he can already at the moment of price setting fix an appropriate price. The data in Table 2, however, do not provide strong evidence for this hypothesis. We come back to the risks that this alternative hypothesis might imply for our econometric analysis in Section 3.

well as the extent of supply and demand shocks may be very indicative.¹³

Basic Evidence on Asymmetric Price Sensitivity

An explorative analysis of our data may also provide a first indication on the kinked demand curve hypothesis that the price elasticity of demand rises in a product's relative price. Figure 1 may be helpful to clarify our identification. Per item we relate real (relative) prices to quantities in natural logs. All relative price and quantity data have been demeaned to account for item specific fixed effects. The average is thus at the origin.

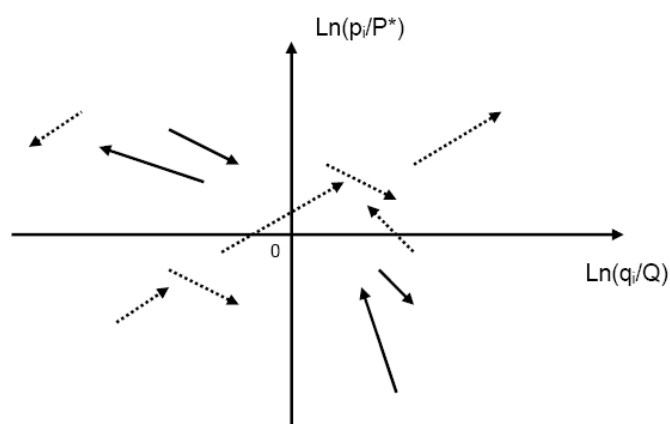


Figure 1: Identification of Asymmetry in the Demand Curve

An important element is then to use supply shocks to identify the demand curve and potential asymmetries in demand. We consider simultaneous increases or decreases in prices and quantities as demand shocks, whereas we consider shifts in prices and quantities that go into opposite directions as supply shocks. Our approach to identify the asymmetry in the demand curve is to use only the price-quantity information that is consistent with movements along the bold arrows. In particular, we use all couples of consecutive (log relative) price-quantity observations that lie in the second or fourth quadrant and that reflect a negative slope. Each couple allows us to calculate a corresponding price elasticity as the inverse of this slope. Price-quantity observations that do not respect this double condition (see the dotted arrows) are not

¹³This exercise is similar to the documentation of macroeconomic stylized facts in Cooley and Ohanian (1991) and Danthine and Donaldson (1993).

considered. For the latter changes it is less clear whether they took place along the (potentially) low or high elasticity part of the demand curve. The last step is to compute the median of all price elasticities that meet our conditions in the second quadrant, where the relative price is high, and to repeat this in the fourth quadrant where the relative price is low.

The data in Table 3 contain the results for the difference between these two median elasticities in absolute value (ε^H and ε^L respectively). The interpretation of the Table is analogous to earlier tables. The price elasticity of demand at high relative price is higher than at low relative price for most of the items analyzed, which would be consistent with the existence of a kinked demand curve. For the median item ε^H is about 1.3 higher than ε^L . Excluding markdowns hardly affects this result. Note however that more than 25% of the items show a convex demand curve. If our econometric analysis in the next sections confirms this heterogeneity, that seems an important result to be taken into account by macro modelers.

Table 3: Asymmetric Price Sensitivity: Difference between ε^H and ε^L

| Percentile | Including markdowns | | | Excluding markdowns | | |
|--|---------------------|------|------|---------------------|------|------|
| | 25% | 50% | 75% | 25% | 50% | 75% |
| Median $\varepsilon^H - \varepsilon^L$ | -3.58 | 1.26 | 7.47 | -3.75 | 1.17 | 7.27 |

Note: ε^H and ε^L are the absolute values of the price elasticity of demand at high and low relative prices respectively. $\varepsilon^H > \varepsilon^L$ suggests that the demand curve is concave (smoothed "kinked"). Reported data refer to the items at the 25th, 50th and 75th percentile ordered from low to high.

Our approach here is rudimentary. A more rigorous econometric analysis, which allows us to control for other potential determinants of demand, is necessary. Yet, our results in Table 3 may shed first light on an important issue, while requiring only limited conditions on the data. The evidence may already be useful for models like the one of Burstein et al. (2006), where the difference between ε^L and ε^H plays a key role in their calibration.¹⁴ For the other models (e.g. Bergin and Feenstra, 2000; Coenen and Levin, 2004; de Walque et al., 2005) with a curvature parameter, we need to do a structural analysis.

¹⁴In their basic calibration Burstein et al. impose $\varepsilon^H = 9$ and $\varepsilon^L = 3$, yielding an equilibrium elasticity of 6, and a steady state mark-up of 1.2. Considering our preliminary evidence in this Section and the evidence on the price elasticity that we referred to in Footnote 1, both the level of the imposed elasticities in Burstein et al. (2006) and the difference between ε^H and ε^L are high.

3 How Large is the Curvature? An Econometric Analysis

In this section we estimate the price elasticity and the curvature of demand for a broad range of goods in our scanner dataset described above. We extend the Almost Ideal Demand System (AIDS) developed by Deaton and Muellbauer (1980a, 1980b) by introducing assumptions drawn from behavioral decision theory. Our "behavioral" AIDS model allows for a more general curvature, which is necessary to answer our research question. The model still has the original AIDS nested as a special case. For several reasons we believe the AIDS is the most appropriate for our purposes: (i) it is flexible with respect to estimating own- and cross-price elasticities; (ii) it is simple, transparent and easy to estimate, allowing us to deal with a very large number of product categories; (iii) it is most appropriate in a setup like ours where consumers may buy different items of given product categories; (iv) it is not necessary to specify the characteristics of all goods, and use these in the regressions. The latter three characteristics particularly distinguish the AIDS from alternative approaches like the mixed logit model used by Berry et al. (1995). Their demand model is based on a discrete-choice assumption under which consumers purchase at most one unit of one item of the differentiated product. This assumption is appropriate for large purchases such as cars. In a context where consumers might have a taste for diversity and purchase several items, it may be less suitable. Moreover, to estimate Berry et al. (1995)'s mixed logit model, the characteristics of all goods/items must be specified. In the case of cars this is a much easier task to do than for instance for cement or spaghetti. Computational requirements of their methodology are also very demanding.

We follow the approach of Broda and Weinstein (2006) to cover as many goods as possible in order to get a reliable estimate for the aggregate curvature, useful in calibrated macro models. In Section 3.1 we first describe our extension of the AIDS model that should enable us to answer our research question. Section 3.2 discusses our econometric setup and identification and estimation. Section 3.3 presents the results.

3.1 Model

Our extension of Deaton and Muellbauer's AIDS model is specified in expenditure share form as

$$s_{it} = \alpha_i + \sum_{j=1}^N \gamma_{ij} \ln p_{jt} + \beta_i \ln \left(\frac{X_t}{P_t} \right) + \sum_{j=1}^N \delta_{ij} \left(\ln \left(\frac{p_{jt}}{P_t} \right) \right)^2 \quad (2)$$

for $i = 1, \dots, N$ and $t = 1, \dots, T$. In this equation X_t is total nominal expenditure on the product category of N items being analyzed (e.g. detergents), P_t is the price index for this product category, p_{jt} is the price of the j th item within the product category and s_{it} is the share of total expenditures allocated to item i (i.e. $s_{it} = p_{it}q_{it}/X_t$). Deaton and Muellbauer define the price index P_t as

$$\ln P_t = \alpha_0 + \sum_{j=1}^N \alpha_j \ln p_{jt} + \frac{1}{2} \sum_{j=1}^N \sum_{i=1}^N \gamma_{ij} \ln p_{it} \ln p_{jt} \quad (3)$$

Our extension of the model concerns the last term at the right hand side of Equation (2). The original AIDS model has $\delta_{ij} = 0$. Although this model is generally recognized to be flexible, it is not flexible enough for our purposes. As we will demonstrate below, the curvature parameter, which carries our main interest, is not free in the original AIDS model. It is a too restrictive function of the price elasticity. This implies that in the original AIDS model it would not be possible to obtain a convex demand curve empirically.

In extending the AIDS model we are inspired by relatively recent contributions to the theory of consumer choice, which draw on behavioral decision theory and also have asymmetric consumer reactions to price changes. Seminal work has been done by Kahneman, Tversky and Thaler. An important idea in these contributions is that consumers evaluate choice alternatives not only in absolute terms, but as deviations from a reference point (e.g. Tversky and Kahneman, 1991). A popular representation of this idea is that consumers form a reference price, with deviations between the actual price and the reference price conveying utility, and thus influencing consumer purchasing behavior for a given budget constraint (see Putler, 1992). We translate this idea to the context of standard macro models where consumers base their

decisions on the price of individual goods relative to the aggregate price, as in Dixit and Stiglitz (1977) or Kimball (1995). The aggregate price would thus be the reference price. Within this broader approach, consumers will not only buy less of a good when its price rises above the aggregate price due to standard substitution and income effects, but also because the price rise may provoke negative feelings (utility losses). The consumer may for example feel being treated unfairly, like in Okun (1981) or Rotemberg (2002). Inversely, the consumer will buy more of a good for given actual prices and income when the actual price is below the aggregate. Experiencing a relatively low price may in itself provoke a utility gain.

Figure 2 illustrates this argument. A key element is that the slope of an indifference curve through a single point in a good 1 and good 2 space will depend on whether the actual price is relatively high or low compared to the relevant aggregate (reference) price. Initial prices of goods 1 and 2 are p_1^a and p_2^a . Both are equal to the aggregate price. The consumer maximizes utility when she buys q_1^a (point a). Then assume a price increase for good 1 to p_1^b , rotating the budget line downwards. Traditional income and substitution effects will make the consumer move to point b, reducing the quantity of good 1 to q_1^b . Additional relative (or reference) price effects, however, will now shift the indifference surface. With p_1 now relatively high, the indifference curve through point b will become flatter. Intuitively, since buying good 1 conveys utility losses, the consumer is willing to give up less of good 2 for more of good 1. The marginal rate of substitution falls. The consumer reaches a new optimum at point d. Relative price effects on utility therefore induce an additional drop in q_1 to q_1^d . Note that a similar graphical experiment can be done for a fall in p_1 . Tversky and Kahneman's (1991) loss aversion hypothesis would then predict opposite, but smaller relative price effects, implying a kink in the demand curve (see also Putler, 1992).

The implication of this argument is that relative price effects on utility and the indifference surface should be accounted for in demand analysis. The added term $\sum_{j=1}^N \delta_{ij} \left(\ln\left(\frac{p_{jt}}{P_t}\right) \right)^2$ in Equation (2) allows us to capture these additional effects. Provided that standard adding up

($\sum_{i=1}^N \alpha_i = 1$, $\sum_{i=1}^N \gamma_{ij} = 0$, $\sum_{i=1}^N \beta_i = 0$, $\sum_{i=1}^N \delta_{ij} = 0$), homogeneity ($\sum_{j=1}^N \gamma_{ij} = 0$) and symmetry ($\gamma_{ij} = \gamma_{ji}$) restrictions hold, our extended equation is a valid representation of preferences. It

has all the characteristics it should have, conditional on relative price effects on utility.

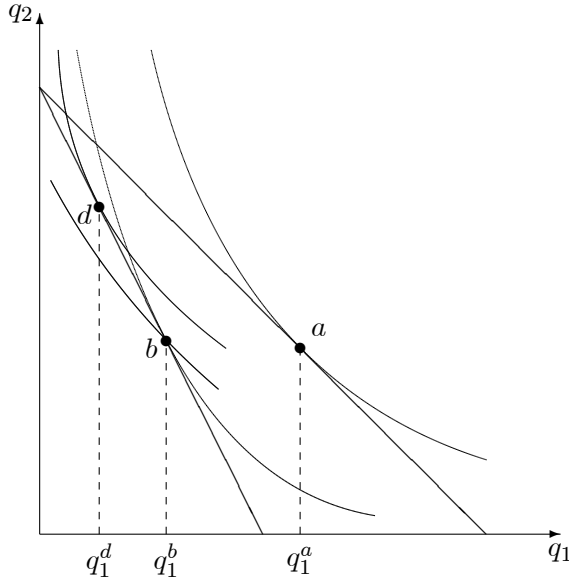


Figure 2. The effects of increasing the price of good 1

Dropping the time subscripts, a general definition of the (positive) uncompensated own price elasticity of demand for good i is:

$$\begin{aligned} \varepsilon_i &= -\frac{\partial \ln q_i}{\partial \ln p_i} \\ &= 1 - \frac{\partial \ln s_i}{\partial \ln p_i} \end{aligned} \quad (4)$$

where $q_i = s_i X / p_i$. Applied to our "behavioral" AIDS model, ε_i can then be derived from Equation (2) as

$$\varepsilon_{i(AIDS_BEH)} = 1 - \frac{1}{s_i} \left(\gamma_{ii} - \beta_i \frac{\partial \ln P}{\partial \ln p_i} + 2\delta_{ii} \ln\left(\frac{p_i}{P}\right) - 2 \sum_{j=1}^N \delta_{ij} \ln\left(\frac{p_j}{P}\right) \frac{\partial \ln P}{\partial \ln p_i} \right) \quad (5)$$

where we hold total nominal expenditure on the product category X as well as all other prices p_j ($j \neq i$) constant. In the AIDS model the correct expression for the elasticity of the group price P with respect to p_i is

$$\frac{\partial \ln P}{\partial \ln p_i} = \alpha_i + \sum_{j=1}^N \gamma_{ij} \ln p_j \quad (6)$$

However, since using the price index from Equation (3) often raises empirical difficulties (see e.g. Buse, 1994), researchers commonly use Stone's geometric price index P^* instead of P (see Equation (1)). In our empirical work we will use Stone's price index as well. The model is then called the (extended) 'linear approximate AIDS' (LA/AIDS). To obtain the own price elasticity for the LA/AIDS model, we have to start from Stone's P^* and derive

$$\frac{\partial \ln P^*}{\partial \ln p_i} = s_i + \sum_{j=1}^N s_j \ln p_j \frac{\partial \ln s_j}{\partial \ln p_i} \quad (7)$$

Green and Alston (1990) and Buse (1994) discuss several approaches to computing the LA/AIDS price elasticities depending on the assumptions made with regard to $\frac{\partial \ln s_j}{\partial \ln p_i}$ and therefore $\frac{\partial \ln P^*}{\partial \ln p_i}$. A common approach is to assume $\frac{\partial \ln s_j}{\partial \ln p_i} = 0$, such that $\frac{\partial \ln P^*}{\partial \ln p_i} = s_i$. Monte Carlo simulations by Alston et al. (1994) and Buse (1994) reveal that this approximation is superior to many others (e.g. smaller estimation bias). We will therefore use it in our empirical work. The (positive) uncompensated own price elasticity implied by this approach is

$$\varepsilon_{i(LA/AIDS_BEH)} = 1 - \frac{\gamma_{ii}}{s_i} + \beta_i - \frac{2\delta_{ii} \ln(\frac{p_i}{P^*})}{s_i} + 2 \sum_{j=1}^N \delta_{ij} \ln(\frac{p_j}{P^*}) \quad (8)$$

Equation (8) incorporates several channels for the relative price of an item to affect the price elasticity of demand. The contribution of our behavioral extension of the AIDS model is obvious given the prominence of δ_{ii} in this equation. Since s_i is typically far below 1, observing $\delta_{ii} < 0$ would imply that the demand curve is likely to be concave, with ε_i rising in the relative price $\frac{p_i}{P^*}$. When $\delta_{ii} > 0$, it is more likely to find convexity in the demand curve.

At steady state, for relative prices equal to 1, the price elasticity becomes

$$\varepsilon_{i(LA/AIDS_BEH_ST)} = 1 - \frac{\gamma_{ii}}{s_i} + \beta_i \quad (9)$$

Finally, starting from Equation (8) we show in Appendix 5 that the implied curvature of the demand function at steady state is

$$\epsilon_{i(LA/AIDS_BEH)} = \frac{\partial \ln \epsilon_i}{\partial \ln p_i} \quad (10)$$

$$= \frac{1}{\epsilon_i} \left((\epsilon_i - 1)(\epsilon_i - 1 - \beta_i) - \frac{2\delta_{ii}(1 - s_i)}{s_i} + 2(\delta_{ii} - s_i \sum_{j=1}^N \delta_{ij}) \right) \quad (11)$$

Also in this equation the key role of δ_{ii} stands out. For given price elasticity, the lower δ_{ii} , the higher the estimated curvature.

A simple comparison of the above results with the price elasticity and the curvature in the basic LA/AIDS model underscores the importance of our extension. Putting $\delta_{ii} = \delta_{ij} = 0$, one can derive for the basic LA/AIDS model that

$$\epsilon_{i(LA/AIDS)} = 1 - \frac{\gamma_{ii}}{s_i} + \beta_i \quad (12)$$

$$\epsilon_{i(LA/AIDS)} = \frac{(\epsilon_i - 1)(\epsilon_i - 1 - \beta_i)}{\epsilon_i} \quad (13)$$

With β_i mostly close to zero (and zero on average) the curvature then becomes a restrictive and rising function of the price elasticity, at least for $\epsilon > 1$. Moreover, positive price elasticities ϵ almost unavoidably imply positive curvatures, which excludes convex demand curves. In light of our findings in Table 3 this seems too restrictive.

3.2 Identification/Estimation

The sample that we use for estimation contains data for 28 product categories sold in each of the six outlets (supermarkets). The selection of these 28 categories, coming from 58 in Section 2, is driven by data requirements and discussed in Appendix 2. The time frequency is a period of two weeks, with the time series running from the first bi-week of 2002 until the 8th bi-week of 2005. To keep estimation manageable we include five items per product category. Four of these items have been selected on the basis of clear criteria to improve data quality and estimation capacity. The fifth item is called "other". It is constructed as a weighted average of all other items. We include "other" to fully capture substitution possibilities for the four main items.

Specifying "other" also enables us to deal with entry and exit of individual items during the sample period. We discuss the selection of the four items and the construction of "other" in Appendix 2 as well. For each item i within a product category the basic empirical demand specification is:

$$\begin{aligned}
s_{imt} &= \alpha_{im} + \sum_{j=1}^5 \gamma_{ij} \ln p_{jt} + \beta_i \ln \left(\frac{X_{mt}}{P_{mt}^*} \right) + \sum_{j=1}^5 \delta_{ij} \left(\ln \left(\frac{p_{jt}}{P_{mt}^*} \right) \right)^2 + \sum_{j=1}^5 \varphi_{ij} C_{jt} + \lambda_{it} + \varepsilon_{imt} \\
i &= 1, \dots, 5 \quad m = 1, \dots, 6 \quad t = 1, \dots, 86
\end{aligned} \tag{14}$$

where s_{imt} is the share of item i in total product category expenditure at outlet m and time t , X_{mt} is overall product category expenditure at outlet m , P_{mt}^* is Stone's price index for the category at outlet m and p_{jt} is the price of the j th item in the category. As we have mentioned before, individual item prices are equal across outlets¹⁵ and predetermined. They are not changed during the period. This is an important characteristic of our data, which strongly facilitates identification of the demand curve (cf. supra). Furthermore, α_{im} captures item specific and outlet specific fixed effects. Finally, we include dummies to capture demand shocks with respect to item i at time t which are common across outlets. Circular dummies C_{jt} are equal to 1 when an item j in the product category to which i belongs, is mentioned in the supermarket's circular. The circular is common to all outlets. Also, for each item we include three time dummies λ_{it} for New Year, Easter and Christmas. These dummies should capture shifts in market share from one item to another during the respective periods.

Our estimation method is SUR. A key assumption underlying this choice is that prices p_{it} are uncorrelated with the error term ε_{imt} . For at least two reasons we believe this assumption is justified. Problems to identify the demand curve, as discussed by e.g. Hausman et al. (1994), Hausman (1997) and Menezes-Filho (2005), should therefore not exist. First, since our retailer sets prices in advance and does not change them to equilibrate supply and demand in a given period, prices can be considered predetermined with respect to Equation (14). Second, prices

¹⁵The Stone index will differ per outlet due to different individual item weights.

are set equal for all six outlets.¹⁶ We assume that outlet specific demand shocks for an item do not affect the price of that item at the chain level. Of course, against these explanations one could argue that the supplier may know in advance that demand will be high or low, so that he can already at the moment of price setting fix an appropriate price. However, the results in Table 2 do not provide strong evidence for this hypothesis. Demand shocks are of relatively minor importance in driving price and quantity changes. Moreover, many demand shocks may be captured by the circular dummies (C_{jt}) and the item specific time dummies (λ_{it}) included in our equations. They will not show up in the error term. In the same vein, the included fixed effect α_{im} captures the influence on expenditure shares of time-invariant product specific characteristics which may also affect the price charged by the retailer. Therefore, item specific characteristics will not show up in the error term of the regressions either.

A robustness test that we discuss in the next section provides additional support for our assumption that prices p_{it} are uncorrelated with the error term ε_{imt} . Using IV methods we obtain very similar results as the ones reported below.

Following Hausman et al. (1994) we estimate Equation (14) imposing homogeneity and symmetry from the outset (i.e. $\sum_{j=1}^5 \gamma_{ij} = 0$ and $\gamma_{ij} = \gamma_{ji}$). We also impose symmetry on the effects of the circular dummies (i.e. $\varphi_{ij} = \varphi_{ji}$). Finally, note that the adding up conditions ($\sum_{i=1}^5 \alpha_{im} = 1$, $\sum_{i=1}^5 \gamma_{ij} = 0$, $\sum_{i=1}^5 \beta_i = 0$, $\sum_{i=1}^5 \delta_{ij} = 0$) allow us to drop one equation from the system. We drop the equation for "other".

3.3 Results

Estimation of Equation (14) for 28 product categories over six outlets, with each product category containing four items, generates 672 estimated elasticities and curvatures. Since 6 of these elasticities were implausible, we decided to drop them, leaving 666 plausible estimates.¹⁷

¹⁶The data used by e.g. Hausman et al., (1994), Hausman (1997) and Menezes-Filho (2005) do not have this characteristic.

¹⁷These 6 price elasticities were lower than -10 (where our definition is such that the elasticity for a negatively sloped demand curve should be a positive number). Note that we do not include the estimated elasticities and curvatures for the composite "other" item in our further discussion. Due to the continuously changing composition of this "other" item over time, any interpretation of the estimates would be delicate.

First, as we cannot discuss explicitly the 666 estimated elasticities and curvatures, we present our results in the form of a histogram in Figure 3. We find that the unweighted median price elasticity is 1.4. The unweighted median curvature is 0.8. If we weight our results with the turnover each item generates, we do not find very different results. We find a median weighted elasticity of 1.2 and a median weighted curvature of 0.8. Considering the values that general equilibrium modelers impose when calibrating their models, these are low numbers (see Table 6 in Appendix 1). The elasticities that we find are also low in comparison with the existing empirical literature (see Bijmolt et al., 2005). The main reason for our relatively low price elasticity seems to be the overrepresentation of necessities (e.g. cornflakes, baking flour, mineral water) in the product categories that we could draw from our dataset. The estimated price elasticities for luxury goods, durables and large ticket items (e.g. smoked salmon, wine, airing cupboards) are generally much higher.

Figure 4 and Table 4 bring more structure in our estimation results. Excluding some extreme values for the curvature, Figure 4 reveals that the estimated price elasticity and curvature are strongly positively correlated. The correlation coefficient is 0.53.¹⁸ In Table 4 we report the unweighted median elasticity and curvature, and their correlation, conditional on the elasticity taking certain values. The condition that the elasticity is strictly higher than 1 corresponds to the approach in standard macroeconomic models. When we impose this condition, the median estimated price elasticity is 2.4, the median estimated curvature 1.7. Imposing that the elasticity is strictly higher than 3 further raises the median curvature to 5.7. Estimated price elasticities between 3 and 6 seem to go together with a median curvature of 3.5.

We can now reduce the uncertainty surrounding the curvature parameter to be used in calibrated macro models. The empirical literature on the price elasticity of demand surveyed by Bijmolt et al. (2005) reveals a median elasticity of about 2.2. Only 9% of estimated elasticities

¹⁸Figure 4 excludes 38 observations with an estimated curvature higher than 40 or lower than -40. If we exclude only observations with a curvature above +60 or below -60, the correlation is +0.51. Note that most of the extreme estimates for the curvature occur when the estimated price elasticity is very close to zero. Relatively small changes in the absolute value of the elasticity then result into, according to our definition of the curvature, huge percentage changes in the elasticity.

exceed 5. More or less in line with these results, the recent industrial organization literature reports price-cost mark-ups that are consistent with price elasticities between 3 and 6 (see e.g. Domowitz et al., 1988; Konings et al., 2001; Crépon et al., 2002; Dobbelaere, 2004). Combining these results with our findings in Figure 4 and Table 4, a sensible value to choose for the curvature would be around 4. Clearly, this order of magnitude is far below current practice (see again Table 6 in Appendix 1). Only Bergin and Feenstra (2000) impose a lower value. Moreover, considering our results, the values for the curvature imposed by most macro modelers hardly fit their values for the elasticity. Only Woodford's (2005) choice to impose a curvature of about 7 and a price elasticity of about 8 is consistent with our results, if we condition on a price elasticity between 6 and 10 (see Table 4).

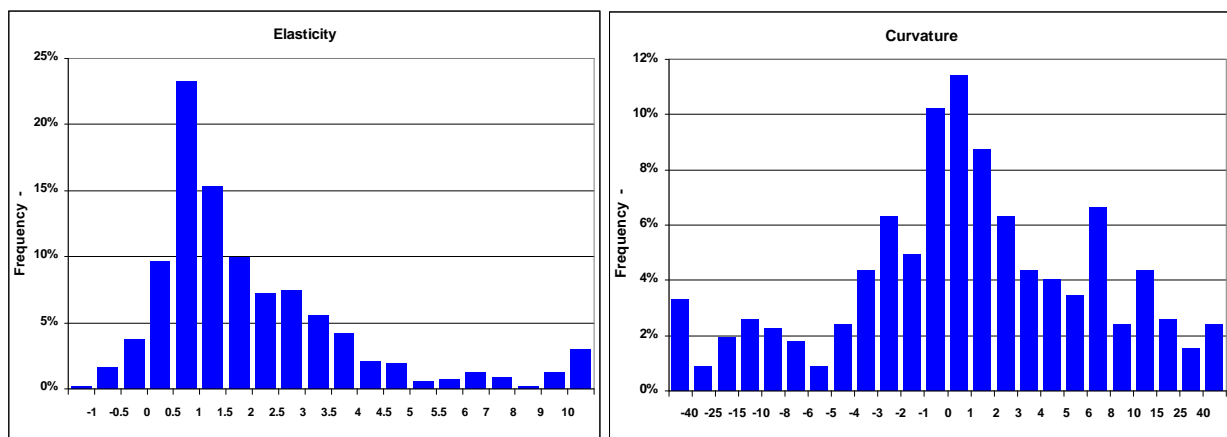


Figure 3: Histograms of Estimated Elasticity and Curvature

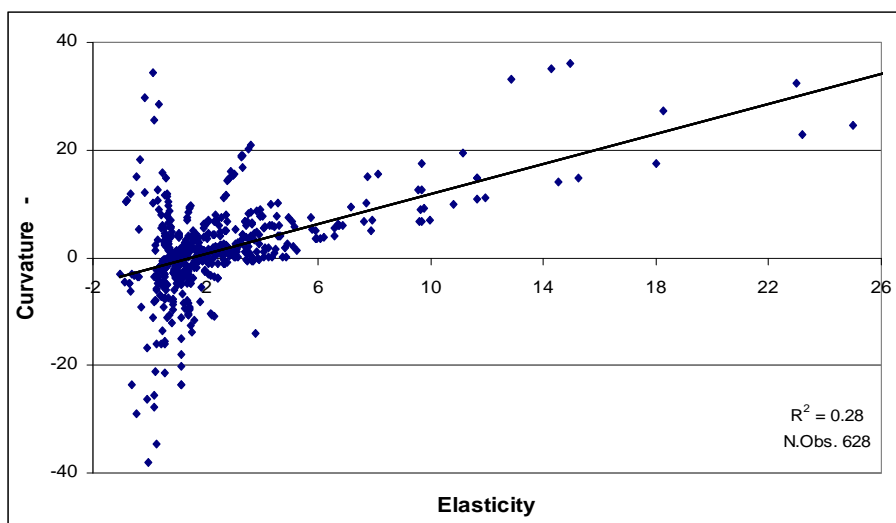


Figure 4: Correlation between Estimated Elasticity and Curvature

Table 4: Estimated Price Elasticity and Curvature

| | Unconditional | Conditional on | | | | |
|--------------------------------------|---------------|----------------|----------------|-----------------------|-----------------------|------------------------|
| | | $\epsilon > 1$ | $\epsilon > 3$ | $1 < \epsilon \leq 3$ | $3 < \epsilon \leq 6$ | $6 < \epsilon \leq 10$ |
| Median Elasticity | 1.4 | 2.4 | 4.2 | 1.8 | 3.7 | 7.8 |
| Median Curvature | 0.8 | 1.7 | 5.7 | 0.8 | 3.5 | 6.8 |
| Correlation (ϵ, ϵ) | 0.12 | 0.45 | 0.40 | 0.33 | 0.02 | 0.53 |
| Fraction $\epsilon < 0$ | 41% | 26% | 6% | 15% | 8% | 0% |
| N.obs. | 666 | 410 | 144 | 266 | 101 | 23 |

Second, our estimated curvatures show that the constant elasticity Dixit-Stiglitz (1977) benchmark is too simplistic. Over the broad range of product categories that we have studied, convex and concave demand curves coexist. About 27% of our estimated curvatures are below -2, about 38% are above +2. The high frequency of non-zero estimated curvatures, including many negative curvatures, supports our argument that the original AIDS model is too restrictive to answer our research question. A key parameter in our behavioral extension is δ_{ii} (see our discussion of Equation (8)). Estimating this parameter, we found it to be statistically significant at less than 10% in 43% of the cases. The high frequency of estimated negative curvatures also confirms the evidence that we obtained in Table 3. A macroeconomic model that fits the microeconomic evidence well should thus ideally allow for sectors with differing elasticities and curvatures.¹⁹ However, conditioning on values for the price elasticity between 2 and 6, which may be more in line with the consensus in the literature, we also have to recognize from Figure 4 that the large majority of demand curves is concave.

Third, in order to find out whether a concave demand curve gives rise to stickier prices, we check whether there is a link between our results on the curvature/elasticity and the size/frequency of price adjustment. In other words, does the supplier act differently for products with a high curvature compared to products with a low curvature. In the marketing literature the ideas of reference pricing and loss aversion are after all quite standard (Tversky and Kahneman, 1991; Putler, 1992), so that price setters can be expected to be aware of this. In a time-dependent model of price adjustment, it could be expected that a higher elastic-

¹⁹See also the evidence on heterogeneous sectoral price rigidity presented in Angeloni et al. (2006) to support this conclusion.

ity/curvature gives rise to smaller price changes, whereas in a state-dependent model of price setting a higher elasticity/curvature gives rise to a lower frequency of price adjustment.

We calculated the correlation between the statistics on nominal price adjustment presented in Table 1 with the 666 estimated elasticities and curvatures. Table 5 reports the results. Our estimated curvatures are not correlated with either the frequency or the size of price adjustment. This finding applies irrespective of including or excluding markdowns. It also applies irrespective of any condition on the level of the curvature (e.g. $\epsilon > 0$) or the elasticity (e.g. $\epsilon > 1$). This may cast doubt on whether the curvature of the demand curve is really an additional source of price rigidity. However, an issue that might drive the absent correlation between the curvature and the frequency and size of price adjustment is the fact that our data refer to a multi-product firm. Midrigan (2006) documents that multi-product stores tend to adjust prices of goods in narrow product categories simultaneously. This is likely breaking the potential relation between individual items' elasticities/curvatures and frequency and size of price adjustment. Things might be different for single product firms. Finally, it cannot be excluded that for other sectors than the retail sector, the curvature of the demand curve has an effect on price rigidity.

Our results for the relationship between the price elasticity of demand and the size and frequency of price adjustment are not very different. Excluding markdowns, correlation is negative. This result may provide some evidence in favor of the role of firm-specific production factors to create additional price rigidity, but the evidence is weak. The correlation is far from statistically significant.

Table 5: Correlation with Nominal Price Adjustment Statistics

| | Including Markdowns | | Excluding Markdowns | |
|------------|---------------------|-------|---------------------|-------|
| | Frequency | Size | Frequency | Size |
| Elasticity | 0.04 | -0.09 | -0.10 | -0.15 |
| Curvature | 0.02 | 0.00 | 0.00 | 0.02 |

Note: The correlations in this Table are calculated using the 666 item elasticity/curvature estimates and their corresponding size and frequency of price adjustment. The column "Excluding Markdowns" indicates that the size and frequency of price adjustment were calculated discarding periods of temporary price markdowns.

We have tested the robustness of our estimation results in four ways. First, we have changed the estimation methodology. A key assumption underlying the use of SUR is that prices p_{it} in Equation (14) are uncorrelated to the error term ε_{imt} . Although we believe we have good reasons to make this assumption, we have dropped it as a robustness check, and re-estimated our model using an IV method. Ideally, one can use information on costs, e.g. material prices, as instruments. However, data on a sufficient number of input prices with a high enough frequency is generally not available. Hausman et al. (1994) and Hausman (1997), who also use prices and quantities in different outlets, solve this problem by exploiting the panel structure of their data. They make the identifying assumption that prices in all outlets are driven by common cost changes which are themselves independent of outlet specific variables. Prices in other outlets then provide reliable instruments for the price in a specific outlet. This procedure cannot work in our setup however since prices are identical across outlets. As an alternative we have used once to three times lagged prices p_i and once lagged relative prices $\frac{p_i}{P^*}$ as instruments. Re-estimating our model for a large subset of the included product categories with the 3SLS methodology, we obtained very similar results for the elasticities and curvatures.

As a second robustness check we have introduced seasonal dummies to capture possible demand shifts related to the time of the year. As we have mentioned before, when suppliers are aware of such demand shifts they may fix their price differently. Not accounting for these demand shifts may then introduce correlation between the price and the error term, and undermine the quality of our estimates. Re-estimating our model with additional seasonal dummies did not affect our results in any serious way either.

Third, we allowed for gradual demand adjustment to price changes by adding a lagged dependent variable to the regression. Although often statistically significant, we generally found the estimated parameter on this lagged dependent variable to be between +0.1 and -0.1. Gradual adjustment seems to be no important issue in our dataset. Finally, our results are based on the assumption that the aggregate price (P_t^*) is the relevant reference price when consumers

make their choice. This assumption is in line with the approach in standard macro models. In marketing literature however it is often assumed that reference prices are given at the time of choice (see e.g. Putler, 1992; Bell and Latin, 2000). As a fourth robustness test we have therefore assumed the reference price to be equal to the one-period lagged aggregate price P_{t-1}^* . Re-estimating our model for a subset of product categories we found that this alternative had no influence on the estimated price elasticities. It implied slightly higher estimated curvatures for most items, however without affecting any of our conclusions drawn above²⁰.

4 Conclusions

The failure of nominal frictions to generate persistent effects of monetary policy shocks has led to the development of models which combine nominal and real price rigidities. Many researchers have recently introduced a kinked (concave) demand curve as an attractive way to obtain real rigidities. However, the literature suffers from a lack of empirical evidence on the existence of the kinked demand curve and on the size of its curvature.

This paper uses scanner data from a large euro area retailer. Our main conclusions are as follows. First, we find wide variation in the estimated price elasticity and the curvature of demand among different products. Although demand for the median product is concave, the fraction of products showing convex demand is significant. Our finding of wide heterogeneity, with negative curvature for a large fraction of products, forms a challenge for the relevant literature. It would suggest the need to model at least two sectors, one with real price flexibility, and another with real price rigidity.

Second, our results support the introduction of a kinked (concave) demand curve in general equilibrium macro models. We find that the price elasticity of demand is on average higher for price increases than for price decreases. However, the degree of curvature in demand is much lower than is currently imposed. Our suggestion would be to impose a curvature parameter

²⁰ Assuming that the reference price equals P_{t-1}^* affects the equation for the curvature. Instead of Equation (11) it then holds that $\epsilon_i = \frac{\partial \ln \epsilon_i}{\partial \ln p_i} = \frac{(\epsilon_i - 1)(\epsilon_i - 1 - \beta_i) - 2\delta_{ii}/s_i}{\epsilon_i}$.

around 4.

Third, we find no correlation between the estimated price elasticity/curvature and the observed size or frequency of price adjustment in our data. Our specific context of a multi-product retailer may however explain this lack of correlation.

Finding lower curvature than generally imposed, there must be other frictions at work, e.g. frictions due to the introduction of firm-specific marginal costs or a durable goods sector as in Barsky et al. (2004). Or we need a combination with another reinforcing friction as in Bergin and Feenstra (2000), who use the input-output structure of Basu (1995). After all, Bergin and Feenstra (2000) do not need such a high curvature. Finally, there could also be other forms of kinked demand (strategic complementarities) at work, but these are not testable with our data and are probably not relevant in our economic environment. This kind of kink does not come from consumer preferences, but must come from strategic interaction between suppliers.

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Appendix 1: Different Curvatures

This appendix gives an overview of the different calibrations of the "kink" or curvature in the demand curve, that are used in the literature on price setting. Because the curvature is not defined homogeneously across the different papers, we first derive the relationships between these definitions before we compare the parameter values that have been imposed. Table 6 summarizes these parameter values. We use the following notation: $x_i = q_i/Q$ is firm i 's relative output, p_i is its price, $\varepsilon(x_i)$ is the (positive) price elasticity of demand, $\mu(x_i) = \frac{\varepsilon(x_i)}{\varepsilon(x_i)-1}$ is the firm's desired markup. Assuming an aggregate price level equal to 1, p_i also indicates the firm's relative price.

Coenen and Levin (2004) define the curvature of the demand curve as the relative slope of the price elasticity of demand around steady state:

$$\epsilon = \left[-\frac{\partial \varepsilon(x_i)}{\partial x_i} \right]_{x_i=1} \quad (15)$$

Eichenbaum and Fisher (2004) and de Walque et al. (2005) define the curvature as the elasticity of the price elasticity of demand with respect to the relative price at steady state:

$$\epsilon = \left[\frac{\partial \varepsilon(x_i)}{\partial p_i} \frac{p_i}{\varepsilon(x_i)} \right]_{x_i=1} \quad (16)$$

It can be shown that in steady state both approaches are identical:

$$\frac{\partial \varepsilon(x_i)}{\partial p_i} \frac{p_i}{\varepsilon(x_i)} = \frac{\partial \varepsilon(x_i)}{\partial p_i} \frac{p_i}{\varepsilon(x_i)} \frac{\partial x_i}{\partial x_i} \frac{x_i}{x_i} = \frac{\partial \varepsilon(x_i)}{\partial x_i} \frac{p_i}{x_i} \frac{\partial x_i}{\partial p_i} \frac{x_i}{\varepsilon(x_i)} = -\frac{\partial \varepsilon(x_i)}{\partial x_i} \varepsilon(x_i) \frac{x_i}{\varepsilon(x_i)}$$

Evaluated at steady state ($x_i = 1$), this is equal to $-\frac{\partial \varepsilon(x_i)}{\partial x_i}$.

Kimball (1995) characterizes the curvature in the demand curve by the elasticity of the firm's desired markup with respect to relative output at steady state, i.e.

$$\xi = \left[\frac{\partial \mu(x_i)}{\partial x_i} \frac{x_i}{\mu(x_i)} \right]_{x_i=1} \quad (17)$$

The relationship between ϵ and ξ is as follows:

$$\begin{aligned}\xi &= \left[\frac{\partial \mu(x_i)}{\partial x_i} \frac{x_i}{\mu(x_i)} \right]_{x_i=1} = \left[\epsilon \frac{\partial \mu(x_i)}{\partial \varepsilon(x_i)} \frac{\partial p_i}{\partial x_i} \frac{x_i}{p_i} \frac{\varepsilon(x_i)}{\mu(x_i)} \right]_{x_i=1} \\ &= \left[\epsilon \frac{1}{(\varepsilon(x_i) - 1)^2} \frac{1}{\varepsilon(x_i)} (\varepsilon(x_i) - 1) \right]_{x_i=1} = \frac{\epsilon}{(\varepsilon(1) - 1) \varepsilon(1)}\end{aligned}$$

The approach in Chari et al. (2000) is very close to Coenen and Levin (2004). Optimization yields the following first order condition for demand:

$$p_i = \frac{\lambda}{Q} G'(x_i)$$

with λ the Lagrangian lambda, G the Kimball (1995) aggregator function for household composite consumption Q and (as defined before) $x_i = q_i/Q$. Rewriting this first order condition, we obtain the demand curve $x_i = D(p_i Q/\lambda)$ with $D = (G')^{-1}$. The price elasticity of demand equals

$$\varepsilon(x_i) = - \frac{D'(G'(x_i)) G'(x_i)}{x_i}$$

Evaluated at steady state this is $\varepsilon(1) = -D'(G'(1))G'(1)$. The curvature of the demand curve at steady state can then be obtained as:

$$\epsilon = \left[- \frac{\partial \varepsilon(x_i)}{\partial x_i} \right]_{x_i=1} = D''(G'(1))G''(1)G'(1) + G''(1)D'(G'(1)) - D'(G'(1))G'(1)$$

Since $D'(G'(1)) = 1/G''(1)$ it follows that

$$\epsilon = \frac{D''(G'(1))G'(1)}{D'(G'(1))} + 1 + \varepsilon(1)$$

Chari et al. (2000) define their curvature parameter χ as

$$\chi = - \frac{D''(G'(1))G'(1)}{D'(G'(1))}, \quad (18)$$

from which the relationship with the Coenen and Levin (2004) curvature is:

$$\epsilon = -\chi + 1 + \varepsilon(1) \quad (19)$$

Table 1 summarizes the values for $\varepsilon(1)$, ϵ and ξ that have been imposed in various research papers or that we have computed using the relationships derived above. It is clear that there

is a wide dispersion in the parameter values. The literature suffers from a lack of empirical evidence.

Table 6: Price Elasticity and Curvature of Demand in the Literature

| | $\varepsilon(1)$ | ϵ | ξ |
|-------------------------------------|------------------|---------------------|-------|
| Kimball (1995) | 11 | 471 ^(a) | 4.28 |
| Chari et al. (2000) | 10 | 385 ^(a) | 4.28 |
| Bergin and Feenstra (2000) | 3 | 1.33 ^(b) | |
| Eichenbaum and Fisher (2004) | 11 | 10, 33 | |
| Coenen and Levin (2004) | 5 – 20 | 10, 33 | |
| de Walque, Smets and Wouters (2005) | 3 | 20, 60 | |
| Woodford (2005) | 7.67 | 6.67 ^(a) | 0.13 |
| Klenow and Willis (2006) | 5 | 10 | |

(a) The numbers indicated with (a) are not directly available in the sources indicated. We have calculated them using the relationships derived before in this Appendix. It is often argued in the literature that Kimball (1995) would have imposed a curvature ϵ equal to 33 (see Eichenbaum and Fisher, 2004; Coenen and Levin, 2004). Our calculations show however that Kimball's curvature, as we have consistently defined it, must be much larger.

(b) Bergin and Feenstra (2000) derive a concave demand curve from assuming preferences with a translog functional form. The (positive) own price elasticity of demand is $\varepsilon_i = 1 - \frac{\gamma_{ii}}{s_i}$ with s_i the expenditure share of good i and $\gamma_{ii} = \partial s_i / \partial \ln p_i < 0$. Along the lines set out in Section 3.1. it can be derived that $\epsilon = \frac{(\varepsilon_i - 1)^2}{\varepsilon_i}$. Starting from the imposed $\varepsilon(1) = 3$, ϵ should be 1.33.

Appendix 2: Description of Dataset

Table 7 gives an overview of the 58 product categories that are in the dataset that we used in this paper. Between brackets we indicate the number of items within each category. The available data for all these categories have been used to compute the basic statistics in Section 2. Product categories in *italic* are also included in the econometric analysis in Section 3.

Table 7: Product Categories and Number of Items

| |
|---|
| Drinks: <i>tea</i> (67), coke (39), chocolate milk (9), <i>lemonade</i> (33), <i>mineral water</i> (66), <i>wine</i> (17) port wine (54), gin (21), <i>fruit juice</i> (54), beer (6), <i>whiskey</i> (82) |
| Food: <i>cornflakes</i> (49), tuna (46), <i>smoked salmon</i> (18), <i>biscuit</i> (9), <i>mayonnaise</i> (45), tomato soup (5), <i>emmental cheese</i> (56), gruyere cheese (19), <i>spinach</i> (29), <i>margarine</i> (62), <i>potatoes</i> (26), liver torta (98), <i>baking flower</i> (18), <i>spaghetti</i> (30), coffee biscuits (5), minarine (2) |
| Equipment: <i>airing cupboard</i> (61), knife (19), hedge shears (32), dishwasher (43), washing machine (36), tape measure (15), <i>tap</i> (24), dvd recorder (20), casserole (74), toaster (40) |
| Clothes and related: jeans (79), jacket (88) |
| Cleaning products: dishwasher detergent (43), <i>detergent</i> (43), soap powder (98), <i>floorcloth</i> (11) <i>toilet soap</i> (34) |
| Leisure and education: hometrainer (52), football (32), cartoon (86), dictionary (32), school book (34) |
| Personal care: <i>plaster</i> (33), <i>nail polish</i> (15), handkerchief (63), <i>nappy</i> (64), <i>toilet paper</i> (13) |
| Other: potting soil (33), <i>cement</i> (43), <i>bath mat</i> (48), <i>aluminium foil</i> (5) |

Note: The number of items in a particular product category is stated in brackets. Only the product categories in *italic* are included in the econometric analysis in Section 3.

Our econometric analysis in Section 3 includes four items per product category and a composite of all other items in the category, called "other". Our criteria to select the four items were (long) data availability and (relatively high) market share within the category.²¹ More precisely, we ranked all products within the category on the basis of the total number of observations available (the maximum being 86), and chose those products with the highest number of observations. Among items with an equal number of observations we selected those with the highest market share. If this procedure implied different selections among the six available outlets, we chose those products with the best ranking in most outlets.

The market share of "other" has been constructed as

$$s_{other,t} = \frac{X_{other,t}}{X_t} = \frac{\sum_{j \notin S4}^N p_{jt} q_{jt}}{X_t}$$

²¹Note that both these criteria are strongly (positively) correlated.

with $S4$ the selected four items, and all other variables as defined in the main text. The price index of "other" is the Stone index for all items included in "other".

$$P_{other,t} = \sum_{j \notin S4}^N s_{jt} p_{jt}$$

with $s_{jt} = p_{jt} q_{jt} / X_{other,t}$. Due to different weights the price of "other" will differ across the six outlets.

The reduction to 28 product categories in the econometric analysis in Section 3, coming from 58, has been driven by the following criteria. For a category to be included in the econometric analysis we required (i) data availability in all six outlets, (ii) the four selected items to have a total market share of at least 20% in their product category and (iii) the four selected items to show sufficient price variation. Over the whole time span the four items together should show at least 20 price changes of at least 5%, where we counted the typical V-pattern of a price markdown as 1 price change. At least 3 of these price changes should be regular price changes.

Appendix 3: Identification of Markdowns

Figure 5 illustrates the identification of markdowns for an individual item of potatoes. A markdown is a sequence of three, two or one price(s) that are/is below both the most left adjacent price and the most right adjacent price. To calculate our "excluding markdowns" statistics in Section 2, we have filtered out markdown prices. We have replaced them by the last observed regular price.

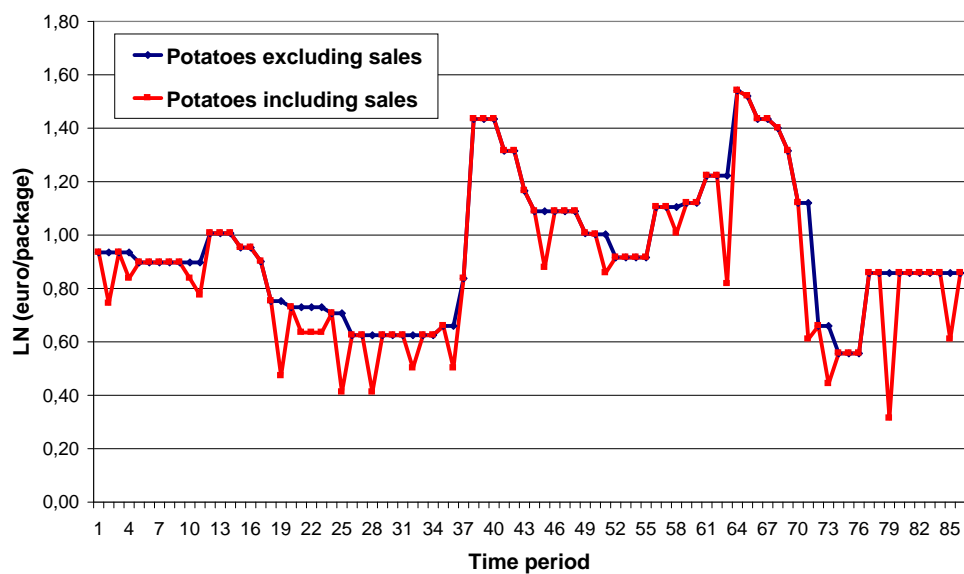


Figure 5: Price for Potato Item Including and Excluding Temporary Markdowns

Appendix 4: Robustness (Fisher price index)

Table 8: Importance of Demand and Supply Shocks

| Percentile | Including markdowns | | | Excl. markdowns | | |
|--|---------------------|-------|-------|-----------------|-------|-------|
| | 25% | 50% | 75% | 25% | 50% | 75% |
| Average absolute $\Delta \ln(p_{it}/P_t^*)$ | 2% | 3% | 4% | 1% | 2% | 3% |
| Average absolute $\Delta \ln(q_{it}/Q_t)$ | 38% | 57% | 76% | 38% | 57% | 76% |
| Standard Deviation $\Delta \ln(p_{it}/P_t^*)$ | 3% | 4% | 7% | 2% | 3% | 5% |
| Standard Deviation $\Delta \ln(q_{it}/Q_t)$ | 50% | 75% | 98% | 50% | 74% | 97% |
| Correlation ($\Delta \ln(p_{it}/P_t^*); \Delta \ln(q_{it}/Q_t)$) | -0.45 | -0.22 | -0.02 | -0.48 | -0.24 | -0.04 |
| % Supply Shocks to $\Delta \ln(p_{it}/P_t^*)$ ^(a) | 48% | 71% | 88% | 50% | 72% | 89% |
| % Supply Shocks to $\Delta \ln(q_{it}/Q_t)$ ^(a) | 50% | 70% | 86% | 50% | 71% | 87% |

Note: The statistics reported in this table are based on bi-weekly data for 2274 items belonging to 58 product categories in six outlets. Individual nominal items prices (p_i) are common across the outlets, all the other data (P^*, q_i, Q) can be different per outlet. (a) The contribution of demand shocks to price and quantity variability equals 1 minus the contribution of supply shocks. Computation methods are described in the main text.

Table 9: Asymmetric Price Sensitivity: Difference between ε^H and ε^L

| Percentile | Including markdowns | | | Excluding markdowns | | |
|--|---------------------|-------|-------|---------------------|-------|-------|
| | 25% | 50% | 75% | 25% | 50% | 75% |
| Median $\varepsilon^H - \varepsilon^L$ | -20.14 | -1.27 | 13.60 | -23.27 | -2.14 | 12.74 |

Note: ε^H and ε^L are the absolute values of the price elasticity of demand at high and low relative prices respectively. $\varepsilon^H > \varepsilon^L$ suggests that the demand curve is concave (smoothed "kinked"). The reported data refer to the items at the 25th, 50th and 75th percentile, ordered from low to high.

Appendix 5: Derivation of Curvature in the Extended AIDS

Starting from Equation (8)

$$\varepsilon_{i(LA/AIDS_BEH)} = 1 - \frac{\gamma_{ii}}{s_i} + \beta_i - \frac{2\delta_{ii} \ln(\frac{p_i}{P^*})}{s_i} + 2 \sum_{j=1}^N \delta_{ij} \ln(\frac{p_j}{P^*})$$

the derivation of the curvature goes as follows:

$$\begin{aligned} \epsilon_{i(LA/AIDS_BEH)} &= \frac{\partial \ln \varepsilon_i}{\partial \ln p_i} \\ &= -\frac{1}{\varepsilon_i} \frac{\partial \left(\frac{\gamma_{ii} + 2\delta_{ii} \ln(\frac{p_i}{P^*})}{s_i} - 2 \sum_{j=1}^N \delta_{ij} \ln(\frac{p_j}{P^*}) \right)}{\partial \ln p_i} \\ &= -\frac{1}{\varepsilon_i} \left(\frac{2\delta_{ii}(1-s_i)s_i - (\partial s_i / \partial \ln p_i)(\gamma_{ii} + 2\delta_{ii} \ln(\frac{p_i}{P^*}))}{s_i^2} - 2(\delta_{ii} - s_i \sum_{j=1}^N \delta_{ij}) \right) \\ &= -\frac{1}{\varepsilon_i} \left(\frac{2\delta_{ii}(1-s_i)}{s_i} + (\varepsilon_i - 1) \left(1 - \varepsilon_i + \beta_i + 2 \sum_{j=1}^N \delta_{ij} \ln(\frac{p_j}{P^*}) \right) - 2(\delta_{ii} - s_i \sum_{j=1}^N \delta_{ij}) \right) \end{aligned}$$

In the third line we again use the (empirically supported) assumption that $\frac{\partial \ln P^*}{\partial \ln p_i} = s_i$. The fourth line relies on the definition that $-\frac{\partial s_i / s_i}{\partial \ln p_i} = (\varepsilon_i - 1)$ and the result derived from Equation (8) that $\frac{\gamma_{ii}}{s_i} + \frac{2\delta_{ii} \ln(\frac{p_i}{P^*})}{s_i} = 1 - \varepsilon_i + \beta_i + 2 \sum_{j=1}^N \delta_{ij} \ln(\frac{p_j}{P^*})$. Rearranging and imposing the steady state assumption that relative prices are 1, we find for the curvature that

$$\epsilon_{i(LA/AIDS_BEH)} = \frac{1}{\varepsilon_i} \left((\varepsilon_i - 1) (\varepsilon_i - 1 - \beta_i) - \frac{2\delta_{ii}(1-s_i)}{s_i} + 2(\delta_{ii} - s_i \sum_{j=1}^N \delta_{ij}) \right)$$

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