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ABSTRACT

Exchange Rate Pass-Through to Consumer Prices in South Africa: Evidence from Micro-Data*

A sizeable literature examines exchange rate pass-through to disaggregated import prices but very few micro-studies focus on consumer prices. This paper explores exchange rate pass-through to consumer prices in South Africa during 2002-2007, using a unique data set of highly disaggregated data at the product and outlet level. The paper adopts an empirical approach that allows pass-through to be calculated over various horizons, including controls for domestic and foreign costs. It studies how pass-through differs across types of consumption goods and services and draws some aggregate implications about pass-through, using actual weights from the CPI basket. The heterogeneity of pass-through for different food sub-components and the role of switches between import and export parity pricing of maize is investigated and found significant for five out of ten food sub-components. Overall passthrough to the almost 63 percent of the CPI covered is estimated at about 30 percent after two years, but is higher for food.

JEL Classification: C23, C51, C52, E3, E31, E52, E58, F31 and F39 Keywords: consumer prices, CPI, exchange rate pass-through, exchange rate volatility, food prices, goods prices, monetary policy and services prices

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1. Introduction

The "Great Moderation", a term coined by Stock and Watson (2002) for an almost universal global decline in inflation and in inflation and output volatility in the two decades to 2007 relative to preceding decades, has heralded a new research focus on the evolution of the inflation process. Understanding the influences on prices, especially of commodity prices and exchange rates where the pass-through of each to import and domestic consumer prices seems to have fallen in industrialised countries since the late 1980s, is of great interest to monetary policy-makers, not least in inflation targeting countries. Accordingly, a burgeoning research topic for emerging market and developing countries in the last decade has been measuring the extent of exchange rate pass-through (ERPT) to aggregate import and consumer price indices and its possible decline in recent years (see review by Aron et al., 2014b).

A new and productive strand of research examines price change behaviour and price stickiness and exchange rate pass-through using monthly sub-components of aggregate price indices, and micro-data sets of the thousands of their underlying prices. Most of the small body of research pertains to the US and Euro-area (e.g. survey in Klenow and Malin, 2010; Gopinath and Itskhoki (2010); and Gopinath, Itskhoki, and Rigobon (2010)). Rigobon (2010) examines commodity price pass-through to micro-data which includes emerging market and developing countries. To our knowledge there are few studies in general, and none published for emerging market countries, which examine ERPT to micro-consumer price data.

Emerging market countries comprise the largest set of those countries which have adopted inflation targeting or more credible monetary policy regimes over the last two decades. Of the African countries, the key exemplar is South Africa (SA), which adopted inflation targeting in 2000 and has presided over a sustained fall in inflation from double digit levels for most of the 1990s to below four percent by 2011. With volatile food and energy prices so important in the inflation process in SA and other African countries, supplementing analysis at the aggregate level (Aron and Muellbauer, 2007, 2009; and Aron et al., 2014a) and sector level (Aron et al., 2009; Aron and Muellbauer, 2012), with micro-level investigations, should advance the understanding of these and other underlying drivers of inflation in SA (see also Parsley, 2012).

This paper employs a unique data set of micro-consumer price data at the product level, covering six years from December 2001, to explore ERPT into micro-prices and some of the key subcategories underlying the aggregate consumer price index (CPI). We examine over one thousand product groups (and over 2.5 million price observations), covering almost 63 percent by index weight of the prices in SA's CPI (Table 1). The period under study spans a shift from relatively high inflation (in mid-2002 to mid-2003) consequent on an exchange rate shock in late 2001 (Figure 1), to a period of lower inflation (mid-2003 to the end of 2006) and back to relatively high inflation (from the end of 2006 to the end of 2007), see Figure 2. [Table 1, Figures 1 & 2 about here]

We use a panel data approach and single equation models that control for matching foreign prices and domestic unit labour costs, and relatively parsimonious lag structures in the exchange rate, domestic unit labour costs and foreign prices, given that the short time period implies limited degrees of freedom. Nevertheless, it is flexible enough to be able to distinguish pass-through at 6, 12, 18 and 24 month horizons. Pass-through for individual micro-prices is aggregated up to the components of the CPI and to the CPI itself. The heterogeneity of pass-through for different sub-components of food, and the role of switches between import and export parity pricing of maize, are specifically investigated. An important feature of this paper is that the actual weights in the CPI basket from the official Consumer Expenditure Survey are used to aggregate the CPI and its sub-components.¹ Hence, calculated pass-through is to a price aggregate that closely reflects the official CPI inflation measure targeted by the central bank.

In the remainder of the paper, Section 2 surveys the handful of studies that directly explore pass-through to the sub-components of the CPI, and also pass-through studies to the aggregate CPI in South Africa. Section 3 lays out conceptual issues and the empirical specification. The methodology and data are discussed in section 4, and the results of the empirical estimations in section 5. Section 6 concludes.

2. Literature survey on micro-studies of pass-through to consumer prices

Recent work has focused on price adjustment and flexibility using the underlying data of the consumer and producer price indices in various countries. For example, the Inflation Persistence Network (IPN) in the Euro-area has a growing body of work in this area, summarised by Angeloni et al. (2006).

One area of interest is the pass-through of external shocks from the exchange rate and commodity prices to domestic prices. Yet, as Soffer (2006) remarks: "The literature is not overflowing with research that estimates the pass-through from the exchange rate to the consumer price index in a disaggregate manner". There are rather more studies on disaggregated import prices to the product level, given the standardisation of international definitions of traded goods (see survey in Aron et al., 2014b).

A number of studies examine a lesser breakdown of the CPI into its sub-components. These include inflation forecasting analyses with sub-aggregates, with indirect implications for pass-

¹ Rigobon (2007) assumes equal weights for South Africa's consumer prices; and so does Parsley (2012), for the set of goods prices and the set of services prices from the EIU.

through. One example for the ten sub-components of the South African CPI is Aron and Muellbauer (2012), which also surveys international research on disaggregated forecasting approaches for the CPI.

Only a handful of studies directly explore pass-through to the sub-components of the CPI. Belaisch (2003) examines pass-through for four CPI components for Brazil using a differenced VAR model. She finds higher pass-through for free prices than for administered prices, and higher passthrough for tradables (about 15 percent after 16 months) than nontradables prices (all are CPI components). At a greater level of disaggregation, Leung (2003) examines many sub-components of Canada's CPI, controlling for world prices with matching components, and finds pass-through mainly in the food components. The difficulty in pinning down pass-through for the other components is attributed to the high volatility of the sub-components relative to the aggregate. Long-run passthrough to the aggregate of consumer prices is somewhat lower than that found for South Africa (see below), at about 17 percent. Soffer (2006) investigates pass-through in Israel for 31 components of the CPI. Quarterly estimation using independent equations with an autoregressive distributed lag structure for each differenced component has the same numbers of lags in the lagged dependent variable as the exchange rate, and controls for foreign prices by matching foreign currency import components with the CPI components, or using nominal wages for non-traded components. Overall long-run passthrough in Israel, at 29 percent between 1991 and 2004, is a weighted average of the underlying passthrough measures using the CPI weights. Pass-through fell dramatically with the stabilization of the exchange rate and lower inflation after 1999, established using a dummy interaction effect (from 33 percent before 1999 to 24 percent from 1999). Half of the pass-through reflects the housing component as the housing rental market is heavily dollarized (but it is also influenced by the method of calculating house prices). Other dollarized sectors include electricity and fuel. Tradable goods have positive pass-through, and so do many apparently non-tradable goods and services. The dollarized components thus will heavily influence pass-though. Dollarization is a special case that may be pertinent for some countries, but less so for South Africa.

Apart from the present paper, two other studies examine disaggregated consumer prices for South Africa. Parsley (2012) uses an innovative dataset of 158 annual consumer prices for South Africa compiled at year's end by the Economist Intelligence Unit for 1990-2009, which he partitions into goods and services prices². Within each of these sets the prices are pooled, and panel regressions with fixed effects are run to establish pass-through. Thus, the micro-data are effectively aggregated into two sub-sets of overall prices (but assuming equal weights for the prices in each of the two subsets), and the heterogeneity of price changes is addressed through inclusion of product dummies. Parsley finds that the average pass-through from the previous and current years' exchange rate changes to the current price change is about 15 percent for the goods and, unexpectedly, about

 $^{^{2}}$ This data set is used for the remuneration of expatriate employees and represents high-end consumer goods and services.

double that at 30 percent for the services sub-total. Parsley's analysis gives an interesting perspective on pass-through in South Africa with micro-data, but it is distinct from the current paper. In our paper, over 2.5 million underlying monthly consumer prices are examined (see Table 1), and the aggregation uses the weights of the CPI basket from the consumer expenditure survey.

Rigobon has used the far more detailed underlying data for the CPI for ERPT in a preliminary mimeo for South Africa (Rigobon, 2007). The 2007 study by Rigobon uses monthly price data for 2001-2005 on approximately 5000 items underlying the construction of the CPI in South Africa. He constructs "aggregate price changes" by averaging the individual price changes into sectoral CPI classifications, thus without weighting the underlying prices. This is a great simplification, and the resultant "aggregate indices" will bear little resemblance to the aggregate CPI measures where components are regularly re-weighted using consumer price surveys. He estimates rolling window regressions for the log change in these "aggregate indices" on a constant and the monthly exchange rate changes over two years (the sample thus gets progressively larger). He computes pass-through as the sum of the coefficients on monthly exchange rate changes over two years. He also estimates item-by-item and computes the average pass-through in the economy by averaging out the individual estimates. There are no controls for foreign prices or domestic prices, and this may bias the exchange rate coefficients and intercept term. There also are few lags. Substantial falls in pass-through for CPI and PPI are noted from 2003 compared with 2001 and 2002.

Estimates of ERPT to the *aggregate* consumer price index are reported for several studies for South Africa. The range of results suggests that after one or two years, South Africa's ERPT to consumer prices is incomplete and rather low at between 12 and 33 percent. The methodologies include differenced single equations in cross-country studies, differenced VARs, and the Johansen systems method. Single equation analyses (mainly using annual data) report a wide range of results at different horizons and data frequencies. The single equations are predominantly specified in differences only, omitting possible long-run relationships between the variables in levels. Since cointegration between the CPI and its determinants is found in other studies for South Africa (e.g. Aron and Muellbauer, 2012), misspecification is likely with biased pass-through coefficients.

In analyses based on VARs, Bhundia (2002) estimates a six-variable linear differenced VAR with a restrictive recursive ordering from a Choleski decomposition, permitting no reverse feedbacks. The quarterly estimation covers 15 years for the CPI from 1980 and the policy-relevant targeted inflation measure, CPIX.³ Korhonen and Wachtel (2005) employ a standard VAR in differences over a very short monthly sample for the CPI (1999-2004) with four variables including the oil price and foreign CPI as proxies for foreign prices. These VAR results yield a range of pass-through measures from 12 to 19 percent after two years. The Johansen results of Kaseeram appear to be mis-specified in not controlling for foreign prices, and including only domestic unit labour costs. The long-run pass-

³ A constructed measure of the CPIX is used for the years prior to its first publication in 1994, but this CPIX construction is incorrect, see Aron and Muellbauer (2004).

through measure is very low at 8 percent. No study of the aggregate CPI attempts to control for the considerable structural change experienced by South Africa in the period, notably the opening of the trade account from 1990 and the capital account from 1995, which influences pass-through to the aggregate import index (Aron et al., 2014a). Most of these studies pre-date the inflation targeting monetary policy regime adopted from 2000.

3. Empirical specification and methodology

3.1 Background

The empirical specification is based on a partial equilibrium, micro-founded mark-up equation, and commonly used in the empirical analysis of pass-through with aggregate and disaggregated price data. Aron et al. (2014b) outline this model, which generalises the formulation of Campa and Goldberg (2005) by introducing the importing country's domestic costs into the mark-up function, and exogenous commodity prices into the foreign exporter's marginal cost function. This can be expressed as a long-run log linear regression specification for *Stage 1 pass-through* of exchange rates to import prices, determined by the nominal exchange rate, domestic and foreign costs and demand variables.

The *Stage 2 pass-through* of import prices to consumer prices can be thought of as a weighted combination of import price pass-through to producer prices, and producer price pass-through to consumer prices, down the price distribution chain to retail prices. By substituting the determinants of import prices into an equation for producer prices, and then doing the same for producer prices in an equation for consumer prices, both import prices and producer prices can be eliminated. Then the reduced form equation for ERPT to the CPI will have the same form as the equation for *Stage 1 pass-through* to import prices though the coefficients will be different. This represents *overall pass-through* from exchange rates to consumer prices, combining the two stages. A higher coefficient on domestic unit labour costs and domestic demand conditions, and lower coefficients on the exchange rate and foreign prices of goods and commodities, would be expected than in the equation for *Stage 1 pass-through* to import prices. Thus, the log of CPI can be written as

$$cpi_{t} = c + be_{t} + a_{1}w_{t}^{M} + a_{2}w_{t}^{X} + a_{3}pcom_{t}^{X} + a_{4}y_{t}^{X} + a_{5}y_{t}^{M} + \varepsilon_{t},$$
(1)

where for variables in logs, *c* is a constant, *e* is the (nominal) exchange rate⁴, w^X and w^M are control variables representing exporter costs and domestic costs, $pcom^X$ captures a further element of exporter's costs stemming specifically from commodity prices such as grain or oil prices, and y^M and y^X control for demand of the destination market and exporter's market. The omission of control

⁴ In South Africa, the exchange rate is defined as foreign currency relative to domestic currency, and increases with appreciation.

variables that are correlated with exchange rates could result in biased estimates of the pass-through coefficient, *b*.

Plausible theoretical restrictions on equation (1) are as follows: long-run homogeneity (lack of money illusion) at a given exchange rate implies $a_1+a_2 + a_3 = 1$. Long-run homogeneity taking into account variations in the exchange rate implies, for the foreign prices $b = -(a_1+a_2)$. Then long-run pass-through is measured by $b = -(1 - a_3)$. At one extreme, complete pricing to market in the long-run to the domestic market (local currency pricing) would imply b = 0; and at the other, complete pass-through (that is, with producer currency pricing) would mean b = -1 and $a_3 = 0$.

In the short run, these long-run restrictions might not hold. The long run is here defined as conditional on domestic unit labour costs. In the very long run, these domestic costs might themselves be influenced by the exchange rate and foreign prices; some consumer price pass-through in the long run could rise through these feedback effects. A drawback of single equation methods is that they assume the exogeneity of all the variables on the right hand side of equation (1), and hence exclude such feedback effects, potentially introducing biases.⁵

Many studies address potential non-stationarity problems in equation (1) by differencing the data to form stationary series. Prices and cost variables are typically I(1) or trending series (on longer samples than used in this study) and need to be differenced to achieve stationary or I(0) series, for which statistical inference in ordinary least squares regressions (OLS) is valid (see Granger, 1981). Then a first-differenced version of equation (1) is estimated (often with subsets of the control variables), and with up to *n* lags on the different variables to allow for a gradual adjustment to the exchange rate. Neglecting long-run terms by differencing will tend to bias the reported pass-through measures if co-integration between these long-run level variables is present (see Aron et al. (2014b)). The ERPT is measured in the differenced equation as the sum of coefficients on the change in the log of the exchange rate term (Δe_t), for the chosen number of lags.

3.2 Micro-specification

An innovation in this paper is that the various specifications are estimated at a highly disaggregated product level. The monthly data have information on the prices of an individual product for various units in which the product is sold, and across the outlets that sell the product. Price changes can thus be observed in an individual product (i) sold in the specified unit (j) at a particular store (k). The products for which there are monthly price data comprise over 60 percent of the CPI.

The dependent variable is the six month difference in individual prices. The majority of prices do not change every month (Creamer and Rankin, 2008), and thus using one month differences would

⁵ Systems methods, potentially available in longer samples than the one considered in this paper, allow the exchange rate and domestic costs to be endogenous, and hence introduce a role for feedback effects. The resulting measures for pass-through from the two methods will be different (see Aron et al., 2014b).

result in a dependent variable that is overwhelmingly zero. Figure 3 illustrates the un-weighted mean and median six month changes in prices. As shown by the median, even for six month changes, the majority of prices do not change in a number of six month intervals. Furthermore, we are interested in medium-run pass-through of six months to two years rather than short-term monthly pass-through. Given the highly disaggregated nature of the dependent variable prices, the standard errors are expected to be larger than for other similar studies that utilise price indices.

[Figure 3 about here]

We use the differenced empirical specification common in much of the literature, although our data is at a far more disaggregated level than is usual.⁶

$$\Delta_6 cpi_{i,j,k,t} = c_i + \sum_{n=0}^3 [b_n \Delta_6 e_{t-6n} + a_{1,n} \Delta_6 w_{t-6n}^M + a_{i,2,n} \Delta_6 w_{i,t-6n}^X]$$
(2)

where cpi is the price of product *i* sold in units *j* at outlet *k* in period *t*, *c* is a constant, *e* is the nominal exchange rate, w^X is a control variable that captures foreign costs and w^M is a control variable that captures domestic labour costs. In equation (3) pass through after six months is given by b_0 , one year pass-through by $\sum_{n=0}^{1} b_n$, pass-through after eighteen months by $\sum_{n=0}^{2} b_n$ and two year pass-through by $\sum_{n=0}^{3} b_n$. The expected signs for the coefficients of the exchange rate are negative (where a rise denotes an appreciation) and those for cost proxies are positive, and the coefficient estimates should fall between zero and one.

Equation (3) is estimated for each individual product using pooled OLS. For each product *i* (for example, milk) there are a number of different units of sale, *j* (for example 1 litre and 2 litre units) which are measured across a number of different outlets, *k*. Each of the estimations is carried out at the product level (for example, for milk). Using pooled OLS, therefore, the dependent variable is the change in price at the specific product-unit-outlet level (e.g. 1 litre milk at outlet 1), but the constant c_i in the equation is common to all the relevant *j* (units) and *k* (outlets) for this product. In essence we have imposed a restriction that the 'base' change within a product is constant across units and outlets. A less restrictive specification would allow this to vary.⁷

Numerous equations are run for each CPI component (for example, 255 separate OLS regressions are run for the food component alone). The coefficient estimates, as well as associated

⁶ We have also experimented with other specifications that include error correction terms. Given the short timespan of our data there does not seem to be enough long-run information to estimate these well. Inclusion of these terms does not significantly alter the results, however.

⁷ An obvious extension is to allow for fixed effects. A fixed effects estimator would allow the constant to vary by product and store (*i* and *k*) or product, unit and store (*i*, *j* and *k*). Due to the time-consuming nature of the estimation process a full set of results has not been produced controlling for these. Exploratory regressions in some CPI components suggest that the results do not differ fundamentally from those reported here.

variances, are then aggregated based on the individual weightings of the products in the CPI.⁸ To calculate effects for the overall CPI a similar approach is followed, but aggregating up to the CPI as a whole rather than to a component of the CPI. The variance estimates, and hence reported standard errors, for weighted average coefficient estimates are based on the estimated variances for the micro-estimates. This ignores potential covariances between the micro-parameter estimates. To the extent that these covariances might be positive because of omitted common factors, the reported standard errors will be biased downwards. Well-specified models should help protect against such biases.

3.3 Institutional features

There are two institutional features tested for in our pass-through regressions. The first feature is shifts between import parity pricing and export parity pricing for yellow and white maize. This is potentially important for the food component, and specifically for three or four of its sub-components - cereals, meat, dairy products and fats and oils. White maize is a staple food in SA with a weight of about 20 percent in the cereals sub-component, and over 80 percent of production is used for human consumption. Yellow maize is an important feedstuff for poultry and livestock, with over 90 percent used in the meat, dairy, poultry and egg industries. The price of maize is vulnerable to periodic droughts and regional shortages, highlighted by the South African Reserve Bank in the Monetary Policy Review (April 2002) after grain prices more than doubled during 2001-2002.

The domestic price of maize fluctuates between an upper bound given by the import parity price and a lower bound given by the export parity price. In times of shortages, maize trades at close to import parity prices, and in times of surpluses closely matches export parity prices. Meyer et al. (2006) propose a very simple model of wholesale maize prices for the intermediate regime, which they name 'near autarky', since regional trade continues to take place. The wholesale price is then a simple average of import parity and export parity prices. If we extend this and make the further assumption that transport and transactions costs for importers (b_1) are a fixed fraction of the import parity price, and that transport and transactions costs for exporters (b_2) are a fixed fraction of the export parity price, it is possible to derive a simple model of wholesale maize prices. Define an import parity price dummy *IPD*, which equals 1 when the import parity price prevails and a corresponding export parity price dummy, *XPD*, which equals 1 when the export parity price prevails. Then if *PWMAIZE* is the wholesale price of maize, we can derive an equation for it in terms of the international (US) price of maize translated at the dollar-rand exchange rate into rands, *PUSMAIZER*. Since the log import parity price is (log *PUSMAIZER* + b_1) and the export parity price is

⁸ These are the underlying weights, based on the 2000 Income and Expenditure Survey, which were used to construct the CPI basket from January 2002. In 2009, a new CPI basket was introduced based on weights from the 2005-6 Survey.

 $(\log PUSMAIZER - b_2)$, the average of the two is $(\log PUSMAIZER + 0.5(b_1 - b_2))$ and this is assumed to apply in the near autarky regime when *IPD* and *XPD* are both zero. Thus,

$$\log PWMAIZE = IPD(\log PUSMAIZER + b_1) + (1 - IPD - XPD)(\log PUSMAIZER + 0.5(b_1 - b_2)) + XPD(\log PUSMAIZER - b_2)$$
(3)

This implies that

$$\log PWMAIZE = 0.5(b_1 - b_2) + \log PUSMAIZER + 0.5(IPD - XPD)(b_1 - b_2)$$
(4)

This is a remarkably simple result, albeit based on simple assumptions, and suggests that (in logs) the wholesale price of maize is determined by the international price in rands plus a positive or negative shift which depends on (IPD - XPD). Then consumer prices of foods which depend partly on wholesale prices of maize should depend on current and lagged values of (IPD - XPD) and of the rand international maize price, given lags in pass-through. An interesting feature of this result is that, on these assumptions, one should not expect a shift in ERPT with shifts between import parity pricing, near autarky and export parity pricing.

The second institutional feature is a test for a temporary switch from domestic currency invoicing to foreign currency invoicing for some imports, after the currency crisis in SA which began in late 2001. We follow Aron et al. (2014a), who study pass-through to aggregate import prices, and test this hypothesis by interacting a dummy making a smooth transition over two years from the end of 2002 with the 6-month change in the log nominal exchange rate. Aron et al. suggest that pass-through declined from about 2003, which would be consistent with the re-adoption of local currency pricing for some imports once stability was perceived to have returned to the exchange rate. However, with a sample beginning in June 2002, there are too few observations before the interaction term begins in January 2003 for an effective test.

4. Data

In Table 2, the variables included in the model are defined with descriptive statistics. The construction of *IPD* and *XPD* dummies for white maize and for yellow maize was data intensive and is summarised in Table 2, with the definition of the currency invoicing dummy.

[Table 2 about here]

4.1 Aggregate data used in micro-pass-through regressions

The first set of variables comprises price variables: the micro-consumer prices discussed below, the nominal exchange rate, foreign cost proxies and domestic cost proxies. We control for domestic and foreign costs. Our measure of domestic unit labour costs for the manufacturing sector is from the South African Reserve Bank, and is quarterly and seasonally adjusted. For the monthly regressions, a step function of the quarterly unit labour costs data is used, and smoothed with a 3-month moving average.

It is difficult to find a primary control variable capturing the shifting relative costs of a country's aggregated trading partners. The nominal effective exchange rate is shown in Figure 1, where a rise denotes appreciation. We first constructed trade-weighted foreign cost proxies for trading partners by computing $w^{X} = \log NEER + \log P - \log REER$. The corresponding real effective exchange rate, sourced from the South African Reserve Bank, uses producer prices. This aggregate measure captures changing weights over time. It did not prove satisfactory for components of the CPI though it was used in an exercise with the same regressors for all 1006 products. Thus, we also selected matching producer prices from the USA Bureau of Labour Statistics for the more tradeable groups of consumer goods. In addition to using price proxies for costs, we follow Marazzi et al. (2005) and Aron et al. (2014a) and include measures of commodity prices relevant for sub-sectors, such as international oil and grain prices.

The second set of aggregate variables contains the demand controls. We opted for monthly advanced countries' industrial production indices and SA's manufacturing production index. Rates of growth were defined from changes in the logs of these variables after seasonally adjusting them. The growth measures were smoothed with a 3-month moving average. However, in common with many empirical studies these measures were not significant. The short length of the sample, in any case, means there is unlikely to be sufficient variation to detect anything significant.

4.2 Micro-price data

This study uses a large micro-data sample at the unit level of SA's CPI. The original dataset comprises 3,930,977 price records gathered over a 73 month period from December 2001 to December 2007. Each individual price record corresponds to a precisely defined item, including both the type of item and the quantity or unit that it is sold in, sold in a particular outlet at a given point in time. This means that the pricing of individual items can be followed over time within the same outlet.

In March 2006, *Statistics South Africa* changed the price collection methodology from a fax-based approach to one of direct price collection by enumerators. Numeric outlet codes were also changed. This results in a break in the data since it is not possible to compare price changes at store level across this break. In this study we use only data which was recorded with an acceptable capture

status.⁹ The analysis is confined to data which were collected at a monthly frequency. ¹⁰ Since six month changes in prices are constructed, a large number of observations are eliminated, particularly over the period where *Statistics South Africa* changed the survey methodology.

Table 1 provides a summary of the data for this study. Overall there are 2,524,822 price observations on 1006 products.¹¹ By comparison to the weighting of product CPI sub-categories in our data, services such as housing¹² and transport are particularly under-represented. Food, with the highest number of product lines (255), comprises the bulk of the observations in the sample and it is by far the largest component (a weight of 25.15 percent in total CPI). Other components with large numbers of product lines include clothing and footwear (210) and furniture (135), but their weights are only 3.01 and 2.86 percent, respectively, in total CPI. Transport is the second largest component in CPI (weight of 11.66 percent) and medical services the third (weight of 4.59 percent).

In Table 2, the mean six month changes in prices are reported in the first row. These are first calculated at the product level and then aggregated using the CPI weights. This indicates that across the CPI sample, the weighted average six month price change is 2.8 percent. Mean changes and standard deviations for the underlying CPI components are reported in the rest of the table. The average changes are highest in the following components: medical services (4.3 percent), beverages and tobacco (4.0 percent), food (3.4 percent) and housing (3.4 percent). Average changes are lowest for recreation (-1.3 percent) and "other" (-0.5 percent) components. The average decrease in prices in recreation can be explained by the presence of personal computers in this component. Standard deviations also vary across sectors. The components recreation, furniture and clothing have the largest variation in price changes. The housing, beverages and tobacco, and "other" components have the lowest variation in price changes, but they also are the components with the lowest number of product lines.

As indicated earlier, a justification for using six month changes in prices is that the majority of prices in our sample do not change every month so that a monthly model would have highly heteroscedastic residuals. This is a common finding in the literature (see Klenow and Malin, 2010). In Figure 4, this is illustrated by the proportion of prices that change month-on-month by CPI component. The figures also illustrate other salient features of the data. The first is the seasonal nature of the occurrence of some price changes (e.g. the beverages and tobacco component demonstrates

⁹ Various capture codes are used in collecting the data; we excluded capture codes reflecting out of stock goods and incomparable goods, due to changes in quality.

¹⁰ Given that the study is based on six month price changes, prices collected quarterly, annually, or at other nonmonthly intervals have been excluded. This is also the approach adopted in other micro-data studies (see Alvarez et al., 2004).

¹¹ These are the weights in the CPI for South Africa as a whole, as opposed to the weights for "Metropolitan areas" and Metropolitan and other urban areas" as published by *Statistics South Africa*.

¹² Housing costs were excluded due the fact that certain housing sub-sector price information – including the rents of housing, flats and townhouses – is based on a frequently updated price index rather than on actual pricing conduct. Hence, there is a tendency for small but frequent changes in price. This is as a result of a practice by the statistical authorities during the period under review, but subsequently discontinued, that any observed price change over a quarter was distributed over the three months of the following quarter

sharp price increases every March as "sin taxes" announced in the February budget take effect). The second feature is that the average proportion of prices changing each month differs significantly across sectors. Only eight percent of prices change every month on average for clothes and footwear components. This compares with the components food, housing and "other", where on average, more than 20 percent of prices change every month. This price stickiness is not specifically controlled for in this paper. The third feature, see Figures 2 and 3, is quite distinct periods of price changes in the data: a rising inflation in 2002, falling from early-2003 to late-2004, then fairly flat until a mid-2007 rise. The changed survey methodology by *Statistics South Africa* in March 2006 is illustrated by a break in the data; as there are not comparable outlet codes across the break, price changes cannot be traced at the most disaggregated level across the break.

[Figure 4 about here]

5. Results

Results are presented for empirical work which has four objectives. First, to examine ERPT using micro-data aggregated up to the main components of CPI and for the CPI itself, with coverage as shown in Table 1. Second, to focus on pass-through aggregated up to the food component of the CPI, and for the sub-components of food. Third, to test whether there is evidence for a change in currency invoicing behaviour after episodes of exchange rate depreciation. Fourth, to examine for the food component and some of its constituents, the role of import parity pricing for yellow and white maize in times of drought and regional supply constraints, and of export parity pricing in times of surplus.

The full results across all components of the CPI are presented in Table 3. These estimates have imposed some broad sign priors on expected effects: thus, changes in unit labour costs and in foreign prices and currency depreciation should have non-negative effects on the CPI components. Regressors which violated these sign priors were omitted, though temporary reversals in ERPT were permitted. Furthermore, while not all insignificant terms were excluded, reductions were made to fairly parsimonious specifications. White-corrected standard errors are reported since the overlapping nature of the dependent variable induces serial correlation in the residuals, while the presence of many zeroes in the dependent variable creates heteroscedasticity. In Table 4, a summary is given of the cumulative ERPT over 6, 12, and 18 months. The results reported in Table 3 for the food component use the same regressors for all 255 food product lines, although different regressors are likely to be relevant for different components (e.g. different foreign prices). More accurate results for food and its sub-components are given in Table 5, which focuses on food prices, and Table 6 gives a summary of the cumulative ERPT over 6, 12, 18 and 24 months.

[Tables 4 & 5 & 6 about here]

These results indicate that pass-through varies dramatically across CPI components. Food, recreation and the residual category, "other", all have pass-through rates of above 20 percent over two years. Other components such as beverages and tobacco, clothing and footwear and medical care and health expenses have pass-through of 10 percent or less. However, as illustrated by the analysis of the food sub-components, the choice of the foreign price proxy can have a substantial impact on pass-through estimates.

5.1 Pass-through in the CPI and its components

Turning first to Table 3, the detailed results are discussed for the CPI and its components. There are no foreign price controls for six of the components: clothing and footwear, housing, furniture, medical services, personal care and "other", as none of the plausible ones were significant. For the remainder, matching foreign price proxies were chosen (Table 2). The choice of lag structure for the domestic and foreign cost proxies differs amongst CPI components.

Three of the CPI components have *relatively low pass-through rates*: medical care and health expenses, clothing and footwear, and beverages and tobacco. Pass-through for these components is below five percent after a year, reaching up to ten percent after two years. For health care and medical expenses, exchange rate changes have no impact on price changes over six to 24 months; this results from the dominance of services which comprise 80 percent of the component: fees for doctors, dentists and other health related services (such as medical aid and medical insurance payments). For clothing and footwear¹³, ERPT is 4.3 percent over one year, changing little in the long term. This low figure hints at domestic currency pricing with the lagged response linked with the infrequency of price changes for clothing and footwear. This may be due to the nature of the contracts retailers enter into with suppliers. It may also reflect a general fall in world prices of clothing and footwear associated with an increase in Chinese exports over this period, since we do not control for foreign prices. ERPT in the beverages and tobacco component¹⁴ is also relatively low at 3.2 percent after one year and 10.2 percent after two years. The three highest weighted products comprising 40 percent of this component – South African lager and Coca-Cola sold in cans and bottles - are locally produced for the domestic market. The remaining products, such as wine and spirits, are also largely South African produced.

Two further CPI components have *medium pass-through rates*: personal care and transport. Pass-through for these components lies between ten and twenty percent after two years. The personal

¹³ For the clothing and footwear component, we impose a coefficient of zero on contemporaneous changes in the exchange rate since the point estimate was positive. Lags of the exchange rate generally have negative signs but the standard errors are relatively large.

¹⁴ The beverages and tobacco component specification includes the change in US PPI for processed foods and feeds as a foreign price control. For beverages and tobacco we impose a coefficient of zero on the current exchange rate term whose point-estimate is positive.

care component¹⁵ of the CPI includes locally-made products such as toothpaste, shampoos, lotions and cosmetics, and also non-tradable services such as haircuts. Pass-through is 2.2 percent after one year, 9 percent after 18 months and 17.4 percent after two years. Pass-through for the transport component¹⁶ occurs mostly between six months and a year and is 13 percent after one year and 14.7 percent after two. Petrol prices, set by the government every month, are a large proportion of this component. Less than half of the price paid at the pump is the basic fuel price. The remainder comprises taxes, retail and wholesale margins and transport and delivery costs. These non-traded costs temper the impact of exchange rate changes.

The remaining five CPI components have relatively high pass-through rates, between 20 and 50 percent after a two year period. Highest of all is the "other" component of CPI, a residual component that groups together miscellaneous goods and services. These include stationery, watches, membership and professional fees, funeral costs, finance and bank charges, insurance and meals consumed outside of the house. The estimates indicate large and rapid pass-through of 16.7 percent after six months, almost 50 percent after one year, 76.6 percent after 18 months and 80 percent after two years. The individual product level estimations suggest that it is products such as stationery products and services such as food consumed outside of home and bank charges that are driving these. Bank charges include interest rates which tend to rise when the exchange rate depreciates. Imported goods such as personal computers and cellular telephones are among the products with the highest weightings in the recreation component¹⁷. As such, it is not surprising that pass-through rates are fairly rapid, at 13.2 percent after six months, and 31.8 percent after a year. After two years, 40 percent of the exchange rate change has passed through to prices. White goods, many imported, such as fridge/freezers, washing-machines and kettles, as well as lounge and dining room suites, some imported, are included in the 'furniture' component¹⁸. Estimates for furniture indicate that ERPT is 7.4 percent after six months, 22.9 percent after a year, 30.1 percent after 18 months and 31.5 percent after two years.

Much of the housing component of CPI is interpolated from less frequently observed rent data rather than collected on a monthly basis. We lack these data, and the results presented here are based on products such as holidays and types of fuel such as paraffin (kerosene), widely used for cooking, heating and lighting among lower income groups in SA. The presence of a relatively large pass-through effect in our housing component – nine percent after six months, 17 percent after a year and 22 percent after 18 months – could be driven by the effect of exchange rate changes on products such as paraffin.The housing operations component of the CPI contains products such as soaps,

¹⁵ We impose a coefficient of zero on contemporaneous changes in the exchange rate.

¹⁶ For the transport component we include the current and six month lagged Brent oil price change to proxy foreign prices.

¹⁷ The specification for recreation includes a US price index for computer parts and accessories since computers form part of this CPI component. However, the aggregated standard error on this is relatively large.

¹⁸ Estimations for the furniture sub-component include South African unit labour costs.

detergents, polishes and fertilizers. As such we use the chemicals and allied products component of the US PPI to proxy for foreign prices. This component of the CPI also contains services, including laundrette and dry cleaning services, which may not be affected by foreign prices. The estimations indicate a positive and significant relationship between foreign and domestic price changes, and between unit labour costs and local price changes. Pass through for this component is relatively high at 11.6 percent after six months, 28.9 percent after one year and 35.8 percent after 18 months.

The final CPI component in the group with relatively high pass-through rates is also the highest-weighted, the food component. Pass-through is estimated to reach 24.5 percent after 18 months (Table 4).¹⁹ However, as noted above, our preferred estimates for the food component employ a further disaggregation of food into its ten sub-components, discussed further below.

Rigobon (2007) for micro-consumer prices and the Aron et al. (2014a) study of import prices both find pass-through in SA falls after 2003. Even if the adoption of inflation targeting from 2000 had reduced pass-through, this effect might have been overwhelmed by a currency invoicing switch. If so, pass-through should have fallen again as confidence in currency stability gradually returned. For most goods, when taking into account the interaction between the currency invoicing dummy and the 6-month change in the log exchange rate, the estimated differences from the Table 4 are slight and overall ERPT falls by only one percentage point.²⁰ Thus, we find some evidence in support, but with the sample beginning in June 2002, there is little scope to discriminate between ERPT pre- and post-2003.

5.2 Pass-through in the food component and its sub-components

In this section we allow for heterogeneous factors specific to each food group. Results for the ten subcomponents of food where the choice of foreign price proxy and specifications differ by subcomponent are presented in Table 5.

Five food sub-components have *high pass-through rates*. For four of these: vegetables, milk, cheese and eggs, fats and oils, and fruit, ERPT is close to 60 percent or more after two years. For cereals, ERPT is around 55 percent. Exchange rate changes feed through rapidly in the fruit and vegetables sub-components, after six months measuring 21.4 percent for fruit prices and 32 percent for vegetable prices. The remarkably high degree of long-term ERPT for fruit and vegetables is perhaps because of export parity pricing, given that SA is a large net exporter.²¹

Relatively high pass-through rates are found for four remaining categories: meat, fish, sugar and tea, coffee and cocoa; and low pass-through rates for the residual "other food" sub-

¹⁹ For the food component in Table 3, foreign prices are proxied with lags in US maize prices up to 12 months, and the (IPD - XPD) dummy for white maize and unit labour costs are included.

²⁰ Results are available on request from the authors.

²¹ The only foreign price used for fruit was that of bananas, however.

component. For meat, fish and sugar, ERPT is approximately 45 percent after two years. For sugar alone amongst the food components²², there is evidence of a significant drop in 2003-5 to around 33 percent when the currency invoicing interaction effect is included. An EU sugar price index has a small insignificant effect, though domestic unit labour costs are significant. For tea, coffee and cocoa, ERPT is estimated at 38 percent after two years. Unit labour costs are significant and there is a tiny foreign price effect from Brazilian coffee. Unit labour costs are also significant for "other food" but the ERPT is estimated at only 14 percent after two years.²³

The results also indicate the importance of controlling for import and export parity pricing. In cereals, meat, milk, cheese and eggs, and fats and oils, import and export parity pricing dummies for maize might be expected to be relevant. For cereals and the "other food" sub-components, the (IPD - XPD) dummy defined for white maize is significant, and there is some pass-through from foreign maize prices. The (IPD - XPD) dummy for yellow maize enters significantly in the meat, and milk, cheese and eggs sub-components. For fats and oils (which include butter and corn oil, where some maize-price dependence can be expected), and for meat, the dummy is significant at a lag of six months. The international price of beef proves to be a better proxy for international prices than the international maize price; but for fats and oils and for milk, cheese and eggs, lagged international maize prices also feed through significantly.

5.3 Summary

The results suggest that pass-through rates are heterogeneous by CPI component. Overall passthrough into the almost 63 percent of the CPI basket for which there are data indicates that approximately six percent of an exchange rate change reaches consumers after six months, increasing to 18 percent after one year, 26 percent after 18 months and 30 percent after two years. The stabilisation after 18 months suggests that the impact of exchange rate changes on consumer prices does not extend much past this time frame. It is likely that pass-through to the total CPI will be lower, since the items excluded from this study may be less affected by the exchange rate. Nevertheless, it appears that the CPI pass-through estimates from this paper are near the upper end of the 12-33 percent range found in previous studies for the aggregate CPI in SA (section 2). These results are based on ERPT for the food component estimated from the disaggregated results shown in Table 5. Putting the results in Table 5 together, using the weights of each food sub-component, overall ERPT for the food component of CPI is estimated at 25.5 percent after one year and 45.5 percent after two years. This contrasts with a lower figure of 25 percent for specifications restricted to use the same

²² As noted above however, the sample length is not sufficient for robust estimates.

²³ This component contains sauces, condiments and baby food, likely to be mainly domestically produced.

variables for each food item (Table 3 and 4).²⁴ Allowing for heterogeneous factors specific to each food group thus has a notable effect on the estimate of ERPT. Table 6 summarizes the time profile of ERPT for each sub-component and for overall food. ERPT after a year varies between 6.9 and 39.8 percent, and after two years between 14 and 63.8 percent.

6. Conclusions

This paper has examined ERPT to consumer prices in South Africa using a micro data set with over one thousand product groups (and over 2.5 million price observations) dating from December 2001 to December 2007, and covering close to 63 percent by index weight of the prices in the consumer price index (CPI). The micro data reveal substantial differences in the frequency of price changes amongst different types of goods, for example, higher for food than for clothing and footwear. There are also substantial variations over time, for instance, the prices of alcohol and tobacco are far more likely to be adjusted after announcements of tax rate changes in annual budgets in February. At the micro-level most prices do not change at a monthly frequency, and the change in the log of prices over six months was taken as the dependent variable. As a compromise between parsimony and flexibility, changes in the log nominal exchange rate were also measured at 6 month intervals, and lags at 0, 6, 12, and 18 months considered. Controls for changes in domestic unit labour costs and relevant foreign prices were also introduced and retained where relevant. Note that as in much of the single equation ERPT literature, the exchange rate is treated as exogenous (see survey of Aron et al. (2014b) for a discussion of the likely implication that ERPT is then over-estimated).

The estimates were based on OLS regressions at the level of each of 1006 products to estimate the effects of current and previous exchange rate changes on each set of price changes. Non-food products were divided into 10 groups and with the same set of regressors within groups, but potentially different between groups. Food was sub-divided into 10 sub-groups and the same procedure applied. Differences between types of goods in the total pass-through after two years and in the immediacy of pass-through were considerable, for example, far higher for food than for medical care and health expenses or for clothing and footwear. Weighting the estimates by index weights, pass-through after two years for the CPI components covered by the study was estimated at 30 percent, near the upper end of earlier studies on aggregate CPI data for SA. After six months, pass-through is about six percent, 18 percent after 12 months and 26 percent after 18 months.

As noted, these estimates for overall pass-through use food pass-through estimates based on a disaggregation of food into subgroups, with heterogeneous specifications for each. One innovation was to study the effects of import and export parity pricing for maize, which is an important ingredient in cereals and an input into the production of meat, milk, cheese and eggs, and fats and oils.

²⁴ The overall ERPT of 21 percent shown in the penultimate column of Table 4 corresponds to these less preferred estimates.

Quite high degrees of ERPT were found for food components, over 40 percent after two years for all groups except coffee, tea and cocoa and a heterogeneous "other" group. For food as a whole, pass-through is estimated at 46 percent after two years. Interestingly enough, when heterogeneity between different food groups is ignored, and a common set of variables used for each food item, the estimate of overall food pass-through drops to 25 percent and overall pass-through for the CPI basket covered falls from 30 percent to 21 percent. However, for a crude specification, using the same set of regressors and including a single aggregate measure of foreign prices for all 1006 products, overall ERPT is estimated at 34 percent, but somewhat less when sign priors are imposed at the level of each of the 11 broad product groups.

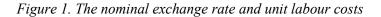
Food is both quite heterogeneous and has a large CPI weight so that the disaggregation is productive. This finding suggests that in future work some of the other broad groups with significant weights, particularly transport goods, should be decomposed into sub-components. The use of microdata has thrown much new light on both the heterogeneity and overall magnitude of ERPT in SA.

Although there is evidence from Rigobon (2007) and Aron et al. (2014a) that pass-through in SA declined from about 2003, with the first observation in June 2002, there is little information in this micro sample to detect a shift beginning in 2003. Future research for a longer micro sample should return to this question given its interest for policy makers and for international research on the apparent decline in exchange rate pass-through in recent years.

References

- Angeloni, I., L. Aucremanne, M. Ehrmann, J. Gali, A. Levin and F. Smets. 2006. 'New evidence on inflation persistence and price stickiness in the euro area: Implications for macro modelling inflation', *Journal of the European Economic Association*, 4(2-3):562-574.
- Aron, J., Farrell, G., Muellbauer, J. and Sinclair, P. 2014a. "Exchange Rate Pass-through to Import Prices, and Monetary Policy in South Africa." *Journal of Development Studies* (forthcoming).
- Aron, J., Muellbauer, J. and R. MacDonald. 2014b. "Exchange Rate Pass-through in Developing and Emerging Markets: a Survey of Conceptual and Policy Issues, and Empirical Findings." *Journal* of Development Studies (forthcoming).
- Aron, J. and J. Muellbauer. 2012. "Improving forecast accuracy in an emerging economy, South Africa, by means of changing trends, long run restrictions and disaggregation." *International Journal of Forecasting* 28 (2): 456-476.
- Aron, J., J. Muellbauer and C. Pretorius. 2009. "A Stochastic Estimation Framework for Components of the South African Consumer Price Index." *South African Journal of Economics* 77 (2):282-313.
- Aron, J. and J. Muellbauer. 2009. "Monetary Policy and Inflation Modeling in a More Open Economy in South Africa." Chapter 15 in New Monetary Policy Frameworks for Emerging Markets: Coping with the Challenges of Financial Globalization, Gill Hammond, Ravi Kanbur and Eswar Prasad (eds.), Bank of England/Edward Elgar, pp.275-308.
- Aron, J. and J. Muellbauer. 2007. "Inflation dynamics and trade openness." Centre for Economic Policy Research (CEPR), London, Discussion Paper 6346.
- Belaish A. 2003. "Exchange Rate Pass-Through in Brazil", IMF Working Paper 03/141.

- Campa, Jose Manuel, and Goldberg, Linda S. 2005. Exchange Rate Pass-Through into Import Prices. *Review of Economics and Statistics*, 87(4):379-90.
- Creamer, K. and N.A. Rankin, 2008, "Price setting in South Africa 2001–2007: stylised facts using consumer price micro data" *Journal of Development Perspectives*, 4(1):93-118.
- Gopinath, G., Itskhoki, O. and Rigobon, R. 2010. Currency Choice and Exchange Rate Pass-Through, *American Economic Review* 100 (1):304-336
- Gopinath, G. and Itskhoki, O. 2010. Frequency of Price Adjustment and Pass-Through. *Quarterly Journal of Economics*, 125(2):675-727.
- Granger, C. 1981. Some Properties of Time Series Data and Their Use in Econometric Model Specification. *Journal of Econometrics* 16(1):121-130.
- Klenow, P.J. & Malin, B.A., 2010. "Microeconomic Evidence on Price-Setting," in: Benjamin M. Friedman & Michael Woodford (ed.), Handbook of Monetary Economics, Vol.3, chapter.6, pp.231-284, Elsevier.
- Leung, D. 2003. "An Empirical Analysis of Exchange Rate Pass Through into Consumer Prices," Internal Bank of Canada manuscript.
- Meyer, F. Westhoff, P., Binfield, J, and Kirsten, J.F. 2006. "Model Closure and Price Formation under Switching Grain Market Regimes in South Africa." Bureau for Food and Agricultural Policy, Department of Agricultural Economics, University of Pretoria, presented at International Association of Agricultural Economists Conference, Gold Coast, Australia, August 12–18.
- Nakamura, A.O., Nakamura, E. and Nakamura, L.I. 2011. "Price dynamics, retail chains and inflation measurement," *Journal of Econometrics*, 161(1):47-55.
- Parsley, D. (2012). Exchange Rate Pass-through in South Africa: Panel Evidence from Individual Goods and Services, *Journal of Development Studies*, 48 (7), 832-846.
- Rigobon, R. 2007. "Through the Pass-Through: Measuring Central Bank Credibility." Harvard University Center for International Development Working Paper 143.
- Rigobon, R. 2010. Commodity prices pass-through. Working Papers 572, Central Bank of Chile, April 2010.
- Soffer, Y. 2006. "Exchange rate pass-through to the consumer price index: a micro approach", Bank of Israel Foreign Exchange Discussion Paper Series, 2.06.
- Stock, James, and Mark W. Watson. 2002. Has the Business Cycle Changed and Why? NBER Macroeconomics Annual 2002, pp.159-218.



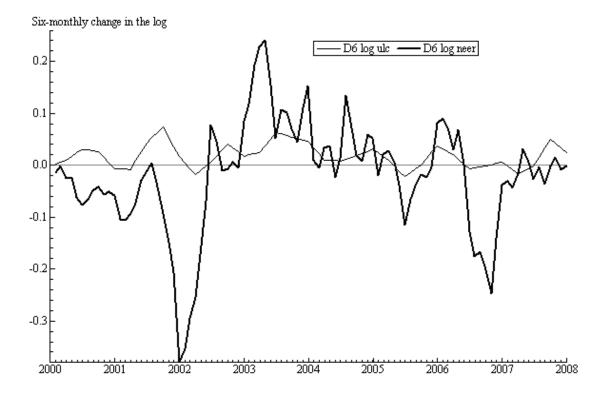
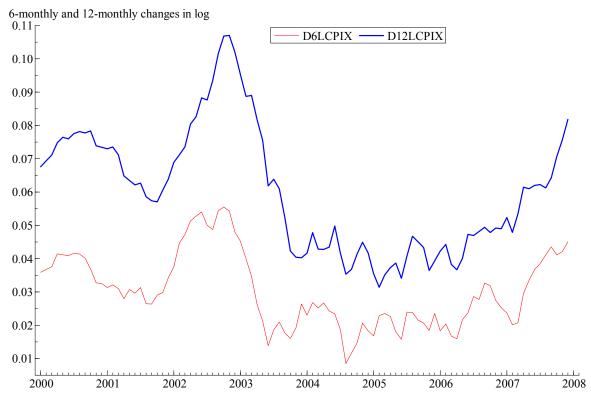


Figure 2. Consumer price indices and inflation in South Africa



Note: Uses CPIX (metropolitan and other urban areas), which is the overall consumer price index, excluding interest rates on mortgage bonds; source: South African Reserve Bank.

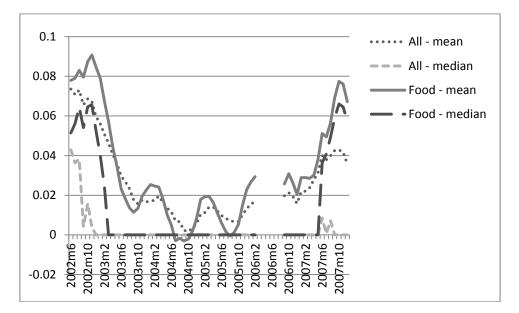


Figure 3. Six month (log) changes in micro-prices

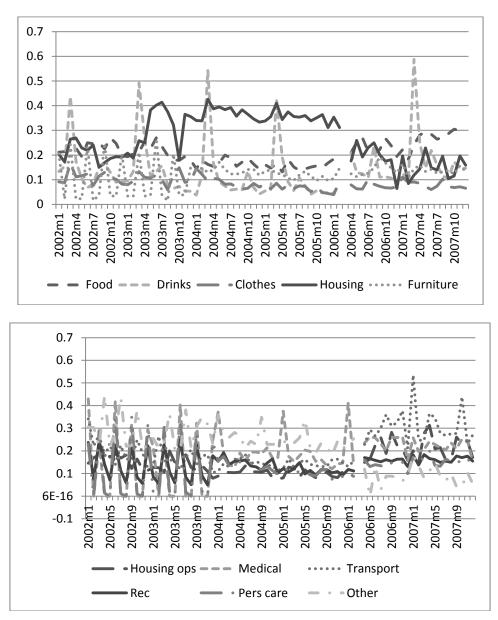


Figure 4. Proportion of prices changing each month

TABLE 1:
The composition of the sample

CPI component	Number of products	Number of observations	Weight† in CPI /%	<i>Examples of products (the 3 highest weighted)</i>
Food	255	1,222,766	25.15	Salt Mealie meal (maize meal) Brown bread
Beverages and tobacco	37	210,797	3.93	South African lager Coca-cola (340ml can) Coca-cola (11 bottle)
Clothing and footwear	210	152,988	3.01	Genuine leather boots Running shoes Rubber slip-ons†
Housing	11	16,534	2.21	Repairs, maintenance and additions Paraffin Holiday flat or house
Furniture	135	199,959	2.86	Lounge suite Dining room suite Fridge/freeze combination
Household operations	60	192,477	1.65	Dishwashing liquid Window cleaner Candles
Medical	29	79,125	4.59	Doctors' fees for medical aid members Dentists' fees for medical aid patients Pain killers
Transport	95	124,158	11.66	Petrol, 93 octane Petrol 97 octane Sedan, 2000 to 2499 CC
Recreation	98	53,299	2.37	Personal computer M-Net subscription Cellular telephones
Personal Care	53	257,417	3.96	Toilet soap Toilet paper Hand and body lotion
Other	19	16,292	1.53	Interest/finance charges Cost of funeral Insurance of contents of dwelling
All products	1006	2,524,822	62.92	

[†] These are the weights in the CPI for South Africa as a whole, as opposed to the weights for "Metropolitan areas" and Metropolitan and other urban areas" as published by *Statistics South Africa*.

TABLE 2:Data Statistics and Variable Definitions

Empirical variable	Theoretical nomenclature	Definition of variables	Mean	Standard Deviation	No. of observations
CONSUMER PRICES ⁺	cpi _{i,j,t}	Measured as the sixth difference of the natural log of the price of product <i>i</i> , measured in unit <i>j</i> at time <i>t</i> .			
$\Delta_6 \log cpi_{i,j,t}$		Total CPI	0.0277	0.1541	1,006
$\Delta_6 \log cpi_{i,j,t}$		Food component	0.0334	0.1634	257
$\Delta_6 \log cpi_{i,j,t}$		Beverages and tobacco component	0.0388	0.0809	37
$\Delta_6 \log cpi_{i,j,t}$		Clothing and footwear component	0.0089	0.2068	210
$\Delta_6 \log cpi_{i,i,t}$		Housing component	0.0334	0.0736	11
$\Delta_6 \log cpi_{i,j,t}$		Furniture component	0.0159	0.2110	135
$\Delta_6 \log cpi_{i,j,t}$		Housing operations component	0.0284	0.1204	60
$\Delta_6 \log cpi_{i,j,t}$		Medical services component	0.0417	0.1216	29
$\Delta_6 \log cpi_{i,i,t}$		Transport component	0.0294	0.1357	95
$\Delta_6 \log cpi_{i,j,t}$		Recreation component	-0.0127	0.2382	98
$\Delta_6 \log cpi_{i,i,t}$		Personal care component	0.0279	0.1504	55
$\Delta_6 \log cpi_{i,j,t}$		Other components	-0.0055	0.0795	19
FOREIGN PRICES	w ^X	Measured as the sixth difference of the natural log of an index of foreign prices. Choice of index varies over CPI components.			
$\Delta_6 \log FPRICE_t$		General CPI components $-w^{X} = \log NEER + \log P - \log REER$, using the real and nominal effective exchange rates and producer prices [Source: monthly, South African Reserve Bank]	0.0149	0.01379	59
$\Delta_6 \log maize_t$		Maize -containing food components – US maize prices price in dollars [Source: monthly, IFS]	0.0481	0.16655	59
$\Delta_6 \log ppi procd_t$		Food and drinks – US PPI component for processed foods and feeds [Source: monthly, US BLS]	0.0200	0.0215	59
$\Delta_6 \log ppifurn_t$		Furniture – US PPI component for furniture and household durables [Source: monthly, US BLS]	0.0074	0.0068	59
$\Delta_6 \log ppichem_t$		Household operations – US PPI component for chemicals and allied products [Source: monthly, US BLS]	0.0356	0.0243	59
$\Delta_6 \log brentoil_t$		Transport – Brent oil price in dollars [Source: monthly, IFS]	0.1089	0.1540	59

$\Delta_6 \log ppicomp_t$		Recreation – Harmonized system import index: computer parts and accessories (EIUIP8473) [Source: monthly, US	-0.0167	0.0187	59
		BLS]			
OTHER VARIABLES AND DU	JMMIES		II		
$\Delta_6 \log neer_t$	е	The sixth difference of the natural log of the trade-weighted	0.0239	0.0870	59
		South African nominal effective exchange rate index, with			
		base $2000 = 100$. A rise is an appreciation.			
$\Delta_6 \log ulc_t$	w^M	The sixth difference of the natural log of unit labour costs in	0.0197	0.0209	59
		the SA manufacturing sector. Interpolated and smoothed in a			
		3-month moving average for monthly regressions. [Source:			
		quarterly, SARB]			
		Dummies for import and export parity pricing regimes: for			
		daily white maize SAFEX prices and daily white maize			
		import and export parity prices (Randfontein), dummies			
		were constructed as follows:			
$(IPD - XPD)_{t=6}^{white maize}$		IPD = 1 if SAFEX price > 0.9 x import parity price; and			
		=0 otherwise.			
		EPD = 1 if SAFEX price < 1.1 x export parity price; and			
		=0 otherwise.			
		These daily dummies were then averaged to monthly data.			
$(IPD - XPD)_t^{yellow maize}$		As above but using yellow maize prices. [‡]			
DCURRINVt		Dummy to capture changes in currency invoicing after			
t		2001: defined as the 12-month moving average of the 12			
		month moving average of a dummy that is 1 from the			
		beginning of 2003 and 0 otherwise. This smooths a			
		transition from 0 at the end of 2003 to 1 in January 2005.			
		Interaction effect: $\Delta_6 e_t \times DCURRINV_t$			

† Weighted, by product. The reported standard deviation is the weighted product level standard deviation. ‡We also experimented with a 0.85 cut-off for the IPD and EPD measures.

TABLE 3:Full regression results – by CPI component

	(1)	(-	2)	((3)	((4)	((5)		(6)
	Fo	ood	Bevera	ges and tobacco	Cloth	ing and footwear	Hot	using	Furi	niture	Household	d operations
	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error
$\Delta_6 \log ppi procd_t$			0.442	0.012								
$\Delta_6 \log ppiprocd_{t-6}$												
$\Delta_6 \log ppichem_t$											0.120	0.035
$\Delta_6 \log ppichem_{t-6}$												
$\Delta_6 \log brent_t$												
$\Delta_6 \log brent_{t-6}$												
$\Delta_6 \log ppicomp_t$												
$\Delta_6 \log ppicomp_{t-6}$												
$\Delta_6 \log u l c_t$	0.120	0.015							0.422	0.141	0.836	0.066
$\Delta_6 \log ulc_{t-6}$									0.733	0.066	0.809	0.050
$\Delta_6 \log neer_t$							-0.090	0.008	-0.074	0.070	-0.116	0.012
$\Delta_6 \log neer_{t-6}$	-0.127	0.002	-0.032	0.002	-0.043	0.012	-0.080	0.005	-0.155	0.025	-0.173	0.007
$\Delta_6 \log neer_{t-12}$	-0.118	0.002	-0.002	0.002	0.002	0.011	-0.046	0.006	-0.072	0.062	-0.069	0.006
$\Delta_6 \log neer_{t-18}$			-0.069	0.002	-0.004	0.018	-0.004	0.005	-0.014	0.046	-0.019	0.006
$\Delta_6 \log maize_t$	0.069	0.002										
$\Delta_6 \log maize_{t-6}$	0.015	0.002										
$\Delta_6 \log maize_{t-12}$	0.049	0.002										
$(IPD - XPD)_t^{white maize}$	0.016	0.001										
March dummy			0.008	0.001								
September dummy			-0.010	0.001								
Constant			0.030	0			0.043	0.001	-0.001	0.006	-0.010	0.003
Share of CPI	25	.15	3.	95	3	.01	2	.21	2.86		1	.65
No of obs	1,22	2,766	210	,797	152	2,988	16,534		199,959		192	2,477
Other:						× period nmies						

	((7)	((8)	(9)	(.	10)	(.	11)	(12)
	Medical co health exp		Trai	isport	Recreation		Personal		0	ther	Aggregate	e – weighted
	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error
$\Delta_6 \log ppiprocd_t$												
$\Delta_6 \log ppiprocd_{t-6}$												
$\Delta_6 \log ppichem_t$												
$\Delta_6 \log ppichem_{t-6}$												
$\Delta_6 \log brent_t$			0.163	0.017								
$\Delta_6 \log brent_{t-6}$			0.020	0.015								
$\Delta_6 \log ppicomp_t$					0.177	0.161						
$\Delta_6 \log ppicomp_{t-6}$												
$\Delta_6 \log u l c_t$												
$\Delta_6 \log ulc_{t-6}$												
$\Delta_6 \log neer_t$	-0.002	0.010			-0.132	0.082			-0.167	0.020	-0.019	0.005
$\Delta_6 \log neer_{t-6}$	0.021	0.005	-0.131	0.028	-0.186	0.085	-0.022	0.035	-0.329	0.007	-0.108	0.007
$\Delta_6 \log neer_{t-12}$	-0.003	0.006	0.052	0.019	-0.098	0.050	-0.068	0.027	-0.270	0.008	-0.059	0.005
$\Delta_6 \log neer_{t-18}$	-0.022	0.005	-0.068	0.017	0.014	0.042	-0.084	0.019	-0.035	0.009	-0.025	0.004
$\Delta_6 \log neer_{t-24}$												
$\Delta_6 \log maize_t$												
$\Delta_6 \log maize_{t-6}$												
$\Delta_6 \log maize_{t-12}$												
$(IPD - XPD)_t^{white maize}$												
March dummy												
September dummy												
Constant	0.040	0.001	0.003	0.005	-0.003	0.006	0.024	0.004	0.003	0.001		
Share of CPI	4	.59	11	.66	2	.37	3.96		1.53		62	2.92
No of obs.	79	,125	124	,158	53	,299	257,417		16,292		2,52	24,822
Other:												

		F 14	Beverage and	Clothing and		F	House- hold operat-	Medical care and health	T	D C	Personal			0 //*
	Food	Food†	tobacco	footwear	Housing	Furniture	ions	expenses	Transport	Recreation	care	Other	Overall	Overall‡
Months:														
6	0.000	-0.095	0.000	0.000	-0.090	-0.074	-0.116	-0.002	0.000	-0.132	0.000	-0.167	-0.019	-0.057
12	-0.127	-0.255	-0.032	-0.043	-0.170	-0.229	-0.289	0.019	-0.131	-0.318	-0.022	-0.496	-0.127	-0.178
18	-0.245	-0.421	-0.034	-0.041	-0.216	-0.301	-0.358	0.016	-0.079	-0.416	-0.090	-0.766	-0.186	-0.257
24	-0.245	-0.455	-0.102	-0.044	-0.220	-0.315	-0.378	-0.006	-0.147	-0.402	-0.174	-0.800	-0.211	-0.296

TABLE 4: Summary of pass-through by CPI components

*With sub-component specific foreign prices.*With sub-component specific foreign prices for food.

	(.	1)	((2)		(3)	((4)	((5)
	Cei	real	М	leat	F	Fish	Milk, ch	eese, eggs	Fats c	und oils
	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error
$\Delta_6 \log foreign \ price_t$					0.014	0.009	0.044	0.006		
$\Delta_6 \log foreign \ price_{t-6}$			0.196	0.006			0.049	0.006	0.109	0.011
$\Delta_6 \log u l c_t$	0.249	0.038					0.638	0.036	0.244	0.063
$\Delta_6 \log ulc_{t-6}$			0.148	0.028			0.371	0.039		
$\Delta_6 \log neer_t$	-0.136	0.007			-0.109	0.016	-0.143	0.010	-0.118	0.014
$\Delta_6 \log neer_{t-6}$	-0.240	0.005	-0.177	0.004	-0.139	0.010	-0.204	0.008	-0.269	0.011
$\Delta_6 \log neer_{t-12}$	-0.150	0.004	-0.256	0.006	-0.107	0.009	-0.191	0.005	-0.160	0.008
$\Delta_6 \log neer_{t-18}$	-0.024	0.005			-0.108	0.009	-0.063	0.006	-0.047	0.010
$\Delta_6 \log maize_t$	0.011	0.004							0.077	0.007
$\Delta_6 \log maize_{t-6}$	0.066	0.003					0.043	0.004	0.102	0.006
$\Delta_6 \log maize_{t-12}$	0.103	0.004					0.042	0.007	0.186	0.007
$\Delta_6 \log maize_{t-18}$	0.105	0.006					0.082	0.010	0.137	0.011
$(IPD - XPD)_t^{white maize}$	0.018	0.001								
$(IPD - XPD)_{t=6}^{white maize}$										
$(IPD - XPD)_t^{yellow maize}$			0.035	0.002			0.012	0.001		
$(IPD - XPD)_{t=6}^{yellow maize}$									0.016	0.002
Constant	0.012	0.001	0.024	0.001	0.030	0.001	0.009	0.001	0.003	0.002
Share	5.34	6.41	0.71	2.33	0.82					
Nobs	171,359	231,158	42,185	120,394	34,336					
Month dummies:	No		No		No		No		No	
Foreign price:			Brazilian be	ef	Norwegian	Fish	New Zealan	d butter	New Zealan	d butter

TABLE 5:Full regression results for food component – by sub- component

	((6)	((7)	((8)	((9)	(-	10)
	F	ruit	Vege	etables	Suz	gar†	Coffee, tea	a and cocoa	0	ther
	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error	Coef	Std Error
$\Delta_6 \log f$ oreign pric	0.071	0.007					0.014	0.004		
$\Delta_6 \log f$ oreign pric					0.018	0.017				
$\Delta_6 \log ulc_t$					0.375	0.047	0.292	0.048	0.361	0.036
$\Delta_6 \log neer_t$										
$\Delta_6 \log neer_{t-6}$	-0.214	0.029	-0.320	0.020	-0.061	0.012	-0.066	0.010		
$\Delta_6 \log neer_{t-12}$	-0.067	0.013	-0.078	0.009	-0.129	0.006	-0.127	0.008	-0.069	0.006
$\Delta_6 \log neer_{t-18}$	-0.160	0.016	-0.240	0.011	-0.072	0.006	-0.116	0.007	-0.030	0.005
$\Delta_6 \log neer_t$	-0.141	0.016			-0.071	0.007	-0.068	0.006	-0.041	0.006
$\Delta_6 \log maize_t$										
$\Delta_6 \log maize_{t-6}$										
$\Delta_6 \log maize_{t-12}$									0.070	0.004
$\Delta_6 \log maize_{t-18}$									0.081	0.008
$(IPD - XPD)_t^{white maize}$									0.021	0.001
$(IPD - XPD)_{t=6}^{white maize}$										
$\frac{(IPD - XPD)_{t-6}^{white maize}}{(IPD - XPD)_{t}^{yellow maize}}$										
$(IPD - XPD)_{t=6}^{yellow maize}$										
Constant					0.016	0.001	0.012	0.001	0.018	0.001
Share	1.15	2.41	0.83	1.20	3.86					
Nobs	126,301	158,711	32,169	50,661	250,238					
Month dummies:	Yes		Yes		No		No		No	
Foreign price:	Latin Ameri	can bananas			EU sugar	·	Brazilian co	ffee		-

*The sugar sub-component is reported in the table without the currency invoicing term. However, the currency invoicing term is significant when included and this is discussed in the text.

	Cereal	Meat	Fish	Milk cheese, eggs	Fats and oils	Fruit	Vegetables	Sugar†	Coffee, tea, cocoa	Other	Overall (weighted)
Months:											
6	-0.136	0.000	-0.109	-0.143	-0.118	-0.214	-0.320	-0.061	-0.066	0.000	-0.095
12	-0.376	-0.177	-0.249	-0.347	-0.387	-0.280	-0.398	-0.190	-0.192	-0.069	-0.255
18	-0.526	-0.433	-0.355	-0.538	-0.548	-0.440	-0.638	-0.262	-0.309	-0.099	-0.421
24	-0.550	-0.433	-0.464	-0.601	-0.595	-0.581	-0.638	-0.333	-0.376	-0.140	-0.455
Weight	5.340	6.407	0.709	2.330	0.816	1.148	2.408	0.827	1.202	3.858	25.046
Relative weight	0.213	0.256	0.028	0.093	0.033	0.046	0.096	0.033	0.048	0.154	1.00

TABLE 6:Summary of pass-through by CPI food sub-components

[†]The sugar sub-component is reported in the table without the currency invoicing term. However, the currency invoicing term is significant when included and this is discussed in the text.