

# **The CIA (consistency in aggregation) approach**

## A new economic approach to elementary indices

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# Outline

1. Motivation
2. Background
3. Economic approach
4. Consistency approach
5. Empirical results
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*“Elementary, my dear Watson!”* (Sherlock Holmes)

# 1. Motivation

- Practical **consumer price indices** are constructed in two stages:
  1. a **first stage at the lowest level of aggregation** where price information is available but associated expenditure or **quantity information is not available** and
  2. a **second stage of aggregation** where **expenditure information is available at a higher level of aggregation.**
- Although the scope of the discussion is on **the choice of the index formula at the elementary level**, this choice eventually **depends on the target price index** at the aggregate level.
- HICP is not intended to measure the cost of living (COLI), rather, it is a **cost of goods index (COGI)**.

## 2. Background

### Bilateral price indices

- We specify **two accounting periods**,  $t \in \{0, 1\}$ , for which we have micro price and quantity data for  $n$  commodities (bilateral index context).
- Denote the **price and quantity** of commodity  $i \in \{1, \dots, n\}$  in period  $t$  by  $p_i^t$  and  $q_i^t$ , respectively.
- A very simple approach to the determination of a price index over a group of commodities is **the (fixed) basket approach**.
- Define the **Lowe (1823) price index**,  $P_{Lo}$ , as follows:

$$- P_{Lo} = \frac{\sum_{i=1}^n p_i^1 \cdot q_i}{\sum_{i=1}^n p_i^0 \cdot q_i} .$$

- There are **two natural choices** for the reference basket:
  - the period 0 commodity vector  $\mathbf{q}^0 = (q_1^0, \dots, q_n^0)$  or
  - the period 1 commodity vector  $\mathbf{q}^1 = (q_1^1, \dots, q_n^1)$ .

## 2. Background

### Laspeyres, Paasche and Fisher

- These two choices lead to
  - the **Laspeyres (1871) price index**  $P_L$ , if we choose  $\mathbf{q} = \mathbf{q}^0$ , and
  - the **Paasche (1874) price index**  $P_P$ , if we choose  $\mathbf{q} = \mathbf{q}^1$ :

$$- P_L = \frac{\sum_{i=1}^n p_i^1 \cdot q_i^0}{\sum_{i=1}^n p_i^0 \cdot q_i^0}, \quad P_P = \frac{\sum_{i=1}^n p_i^1 \cdot q_i^1}{\sum_{i=1}^n p_i^0 \cdot q_i^1}.$$

- According to the CPI Manual (ILO et al., 2004), “**the Paasche and Laspeyres price indices are equally plausible.**”
- Taking an evenly weighted average of these basket price indices leads to **symmetric averages.**
- **The geometric mean**, which leads to the **Fisher (1922) price index**,  $P_F$ , is defined as:
  - $P_F = \sqrt{P_L \cdot P_P}$ .

## 2. Background

### Keynes' pure theory of money

- In his 1930 *A Treatise on Money* (pp. 95-120), Keynes deals with the theory of **comparisons of purchasing power**.
- Comparisons of purchasing power mean comparisons of the command of money over two collections of commodities which are in some sense “equivalent” to one another, and **not over quantities of utility**.
- Applying the “method of limits” establishes that **in any case the measure of the change in the value of money lies between the Laspeyres and Paasche price indices**.
- **The “crossing of formulae”**, to which Fisher has devoted much attention, is, in effect, **an attempt to carry the method of limits somewhat further – further (in Keynes' opinion) than is legitimate**.
- We can concoct **all sorts of algebraic function of  $P_L$  and  $P_p$** , and **there will not be a penny to choose between them**.

## 2. Background

### Elementary indices

- Suppose that there are  **$M$  lowest-level items or specific commodities** in a chosen elementary category.
- Denote the period  $t$  **price** of item  $m$  by  $p_m^t$  for  $t \in \{0, 1\}$  and for items  $m \in \{1, \dots, M\}$ .
- The **Dutot (1738) elementary price index**,  $P_D$ , is equal to the *arithmetic* average of the  $M$  period 1 prices divided by the *arithmetic* average of the  $M$  period 0 prices.
- The **Carli (1764) elementary price index**,  $P_C$ , is equal to the *arithmetic* average of the  $M$  item price ratios or price relatives,  $p_m^1/p_m^0$ .
- The **Jevons (1865) elementary price index**,  $P_J$ , is equal to the *geometric* average of the  $M$  item price ratios or price relatives,  $p_m^1/p_m^0$ , or the *geometric* average of the  $M$  period 1 prices divided by the *geometric* average of the  $M$  period 0 prices.

$$- P_D = \frac{\frac{1}{M} \sum_{m=1}^M p_m^1}{\frac{1}{M} \sum_{m=1}^M p_m^0}, P_C = \frac{1}{M} \sum_{m=1}^M \frac{p_m^1}{p_m^0}, P_J = \sqrt[M]{\prod_{m=1}^M \frac{p_m^1}{p_m^0}} = \frac{\sqrt[M]{\prod_{m=1}^M p_m^1}}{\sqrt[M]{\prod_{m=1}^M p_m^0}}.$$

## 2. Background

### Is the Carli index really “upward biased”?

- The sole argument frequently put forward why the Carli index should be abandoned, is **the claim that it has an “upward bias”** with reference to the time reversal test or circularity test (cf. Diewert, 2012):
  - $P_C(\mathbf{p}^0, \mathbf{p}^1) \cdot P_C(\mathbf{p}^1, \mathbf{p}^2) = P_C(\mathbf{p}^0, \mathbf{p}^1) \cdot P_C(\mathbf{p}^1, \mathbf{p}^0) \geq 1 = P_C(\mathbf{p}^0, \mathbf{p}^0)$  for  $\mathbf{p}^2 = \mathbf{p}^0$ .
- But **this argument is useless in the bilateral index context** where we can compare the two periods under consideration directly, i.e. there is no bias at all:
  - $P_C(\mathbf{p}^0, \mathbf{p}^2) = P_C(\mathbf{p}^0, \mathbf{p}^0) = 1$  for  $\mathbf{p}^2 = \mathbf{p}^0$ .
- In the context of chain indices, **the elementary aggregates only feed into the higher-level indices** in which the elementary price indices – comparing periods  $t-1$  and  $t$  (!) – are averaged using a set of pre-determined weights (chain indices are non-aggregable); **the Dutot, Carli and Jevons indices are, thus, not chain-linked.**
- What is more, it apparently fell into oblivion that **the then chain-linked Laspeyres, Paasche, Fisher, Walsh and Törnqvist price indices are subject to chain drift;** i.e. all chain indices are path dependent, which is the opposite of transitivity.



### 3. Economic approach

- The CPI Manual, paragraphs 20.71-20.86, has a section in it which describes **an economic approach to elementary indices**.
- This section has sometimes been used to **justify the use of the Jevons index**, i.e. the geometric mean, **over the use of the Carli index**, i.e. the arithmetic mean, or vice versa **depending on how much substitutability exists** between items within an elementary stratum.
- **This is a misinterpretation of the analysis** that is presented in this section of the Manual.
- **Thus, the economic approach cannot be applied at the elementary level unless price and quantity information are both available.**
- ***Such information is typically not available***, which is exactly the reason elementary indices are used rather than target indices. (Diewert, 2012, “Consumer Price Statistics in the UK”)

## 4. Consistency approach

### Consistency in aggregation

- **The consistency in aggregation (CIA) approach** newly developed (Mehrhoff, 2010, Jahr. Nationalökon. Statist.) fills the void of **guiding the choice of the elementary index** (for which weights are not available) **that corresponds to the characteristics of the index at the second stage** (where weights are actually available).
- It contributes to the literature by looking at how **numerical equivalence between an unweighted elementary index and a weighted aggregate index** can be achieved, **independent of the axiomatic properties**.
- *Consistency in aggregation* means that **if an index is calculated stepwise by aggregating lower-level indices** to obtain indices at progressively higher levels of aggregation, **the same overall result** should be obtained **as if the calculation had been made in one step**.

## 4. Consistency approach

### Cost of goods index

- To reiterate, we measure the change in the cost of purchasing a fixed **basket of goods and services**, and *not* the change in the minimum cost of maintaining a given level of utility or welfare.
- The use of the **Dutot and Carli formulae** at the elementary level of aggregation for *homogeneous* items can be perfectly **consistent with a Laspeyres index concept**.
- **The Laspeyres price index** can be rewritten in an alternative manner as follows:

$$- P_L = \frac{\sum_{m=1}^M p_m^1 \cdot q_m^0}{\sum_{m=1}^M p_m^0 \cdot q_m^0} = \sum_{m=1}^M \frac{p_m^1}{p_m^0} \cdot \frac{p_m^0 \cdot q_m^0}{\sum_{l=1}^M p_l^0 \cdot q_l^0} = \sum_{m=1}^M \frac{p_m^1}{p_m^0} \cdot s_m^0,$$

- where  $s_m^0$  is the **period 0 expenditure share** on commodity  $m$ .

## 4. Consistency approach

### A thought experiment

- The first case is where the underlying preferences are **Leontief preferences**, i.e. **consumers prefer not to make any substitutions** in response to changes in relative prices (zero elasticity):

$$- q_m^0 = q_m^1 = q \text{ and, hence, } P_L = \frac{\sum_{m=1}^M p_m^1 \cdot q}{\sum_{m=1}^M p_m^0 \cdot q} = \frac{\frac{1}{M} \sum_{m=1}^M p_m^1}{\frac{1}{M} \sum_{m=1}^M p_m^0} = P_D.$$

- The second case is when the preferences can be represented by a **Cobb-Douglas function**, i.e. **consumers vary the quantities** in inverse proportion to the changes in relative prices **so that expenditure shares remain constant** (unity elasticity):

$$- s_i^0 = s_i^1 = M^{-1} \text{ and, hence, } P_L = \sum_{m=1}^M \frac{p_m^1}{p_m^0} \cdot M^{-1} = \frac{1}{M} \sum_{m=1}^M \frac{p_m^1}{p_m^0} = P_C.$$

## 4. Consistency approach

### Generalised means

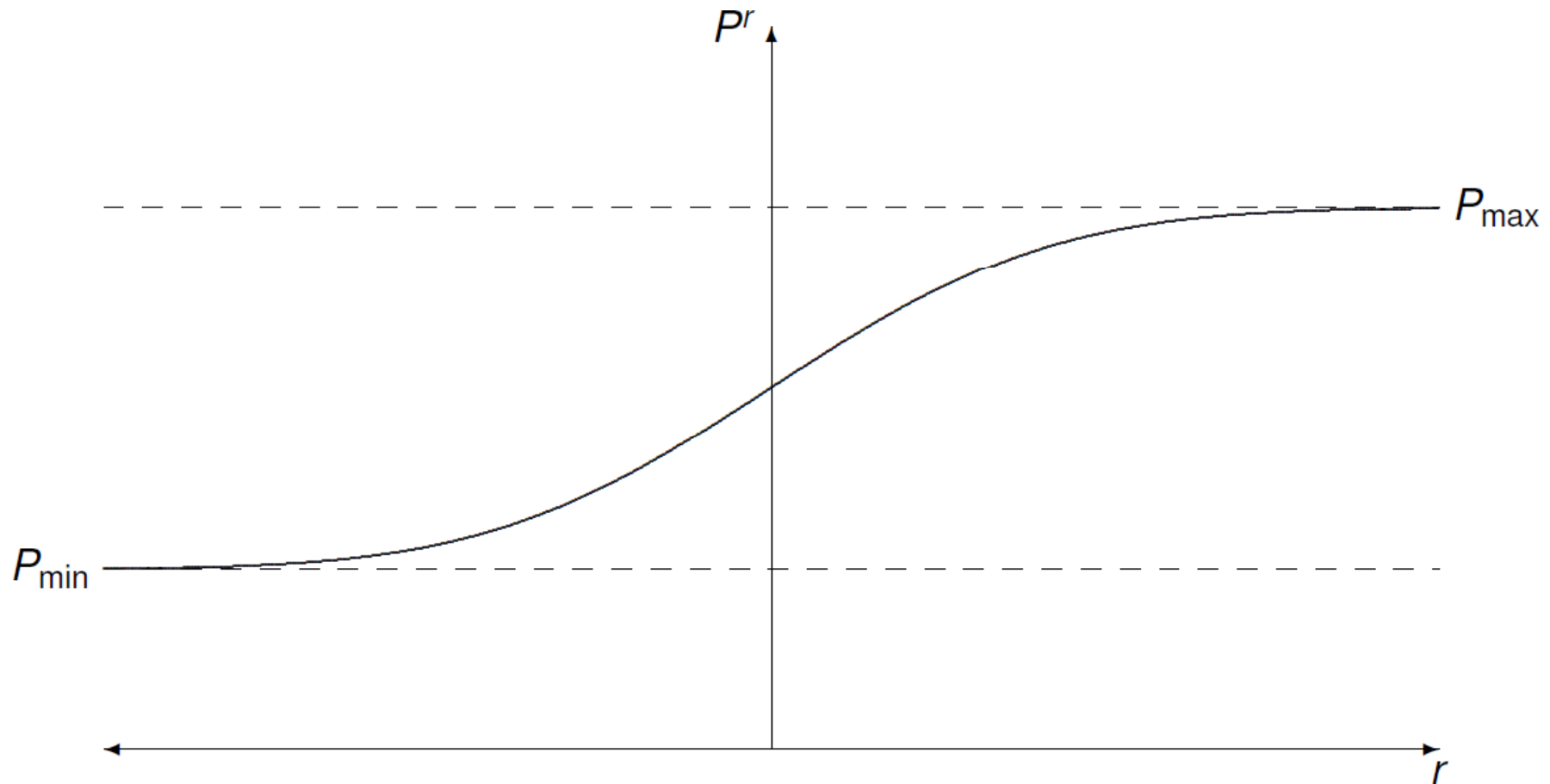
- A single comprehensive framework, known as *generalised means*, **unifies the aggregate and elementary levels**.
- **The generalised mean** of order  $r$  for the  $M$  item price ratios or price relatives,  $p_m^1/p_m^0$ , is defined as follows:

$$- P^r = \begin{cases} \sqrt[r]{\frac{1}{M} \sum_{m=1}^M \left( \frac{p_m^1}{p_m^0} \right)^r} & \text{if } r \neq 0, \\ \sqrt[M]{\prod_{m=1}^M \frac{p_m^1}{p_m^0}} & \text{if } r = 0. \end{cases}$$

- The generalised mean represents **a whole class of unweighted elementary indices**, such as the Carli and Jevons indices for  $r = 1$  and  $r = 0$ , respectively.

## 4. Consistency approach

### Typical shape



$$P_{\min} = \min \left( \left\{ \frac{p_m^1}{p_m^0} \right\} \right), P_{\max} = \max \left( \left\{ \frac{p_m^1}{p_m^0} \right\} \right)$$

## 4. Consistency approach CES aggregator function

– It is supposed that **the unit cost function** has the following functional form:

$$- c(\mathbf{p}) = \begin{cases} \alpha_0 \cdot \left( \sum_{m=1}^M \alpha_m \cdot p_m^{1-\sigma} \right)^{1/(1-\sigma)} & \text{if } \sigma \neq 1, \\ \alpha_0 \cdot \prod_{m=1}^M p_m^{\alpha_m} & \text{if } \sigma = 1, \end{cases}$$

- where the  $\alpha_m$  are non-negative consumer preference parameters with  $\sum_{m=1}^M \alpha_m = 1$ .
- This unit cost function corresponds to a **CES aggregator or utility function**.
- The parameter  $\sigma$  is **the elasticity of substitution**:
  - When  $\sigma = 0$ , the underlying preferences are **Leontief preferences**.
  - When  $\sigma = 1$ , the corresponding utility function is a **Cobb-Douglas function**.

## 4. Consistency approach

### Laspeyres and Paasche price indices

- A generalised mean of order  $r$  **equal to the elasticity of substitution** ( $\sigma$ ) yields approximately the same result as **the Laspeyres price index**.
- Hence, if the elasticity of substitution is one (Cobb-Douglas preferences), for example,  $r$  must equal one and **the Carli index at the elementary level will correspond to the Laspeyres price index as target index**.
- However, if **the Paasche price index** should be replicated, the order of the generalised mean must **equal minus the elasticity of substitution**, in the above example minus one.
- Thus, **the harmonic index gives the same result** and therefore, in this case it should be used at the elementary level.
- **Only if the elasticity of substitution is zero** (Leontief preferences), **the Jevons (Dutot) index corresponds to both the Laspeyres and Paasche price indices** – which in this case coincide.



## 5. Empirical results

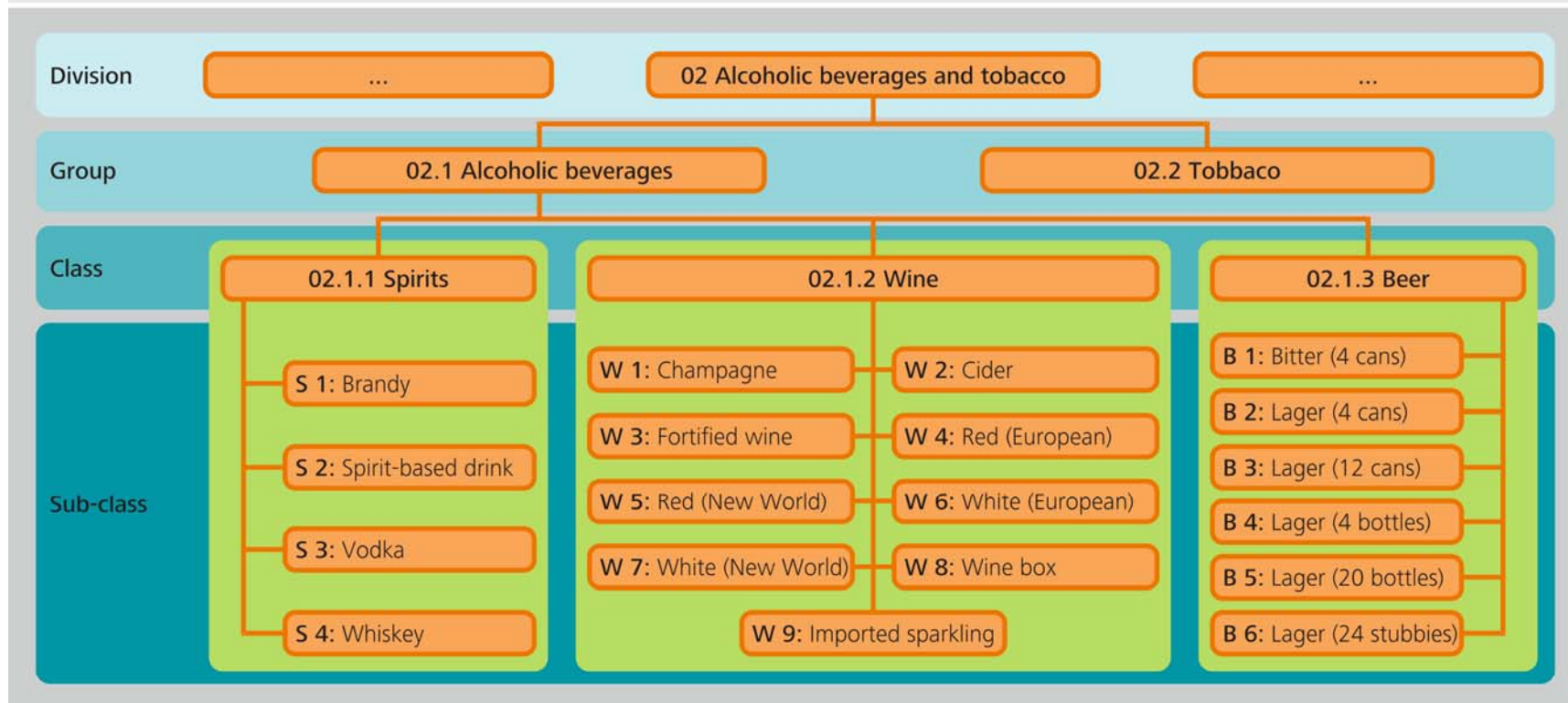
### Alcoholic beverages in the UK

- As an empirical application, **detailed expenditure data** from Kantar Worldpanel for elementary aggregates within the COICOP group of **alcoholic beverages in the UK** are analysed.
- The data cover the period **from January 2003 to December 2011**; the data set consists of transaction level data, which records inter alia purchase price and quantity, and includes **192,948 observations** after outlier identification.
- **The elasticity of substitution** is estimated in the framework of a log-linear model by means of **ordinary least squares**. (Note that the consumer preference parameters are removed via differencing products common to adjacent months and, thus, there is no need for application of seemingly unrelated regression.)
- As a robustness check to the CES model based results, **the generalised mean** which minimises relative bias and root mean squared relative error to the desired aggregate index is found directly by **numerical optimisation techniques**. (Rather than at the aggregate transaction level, like the econometric method, this analysis, however, is performed one level above – at the elementary level.)

# 5. Empirical results

## COICOP structure for alcoholic beverages

COICOP structure of the overall HICP



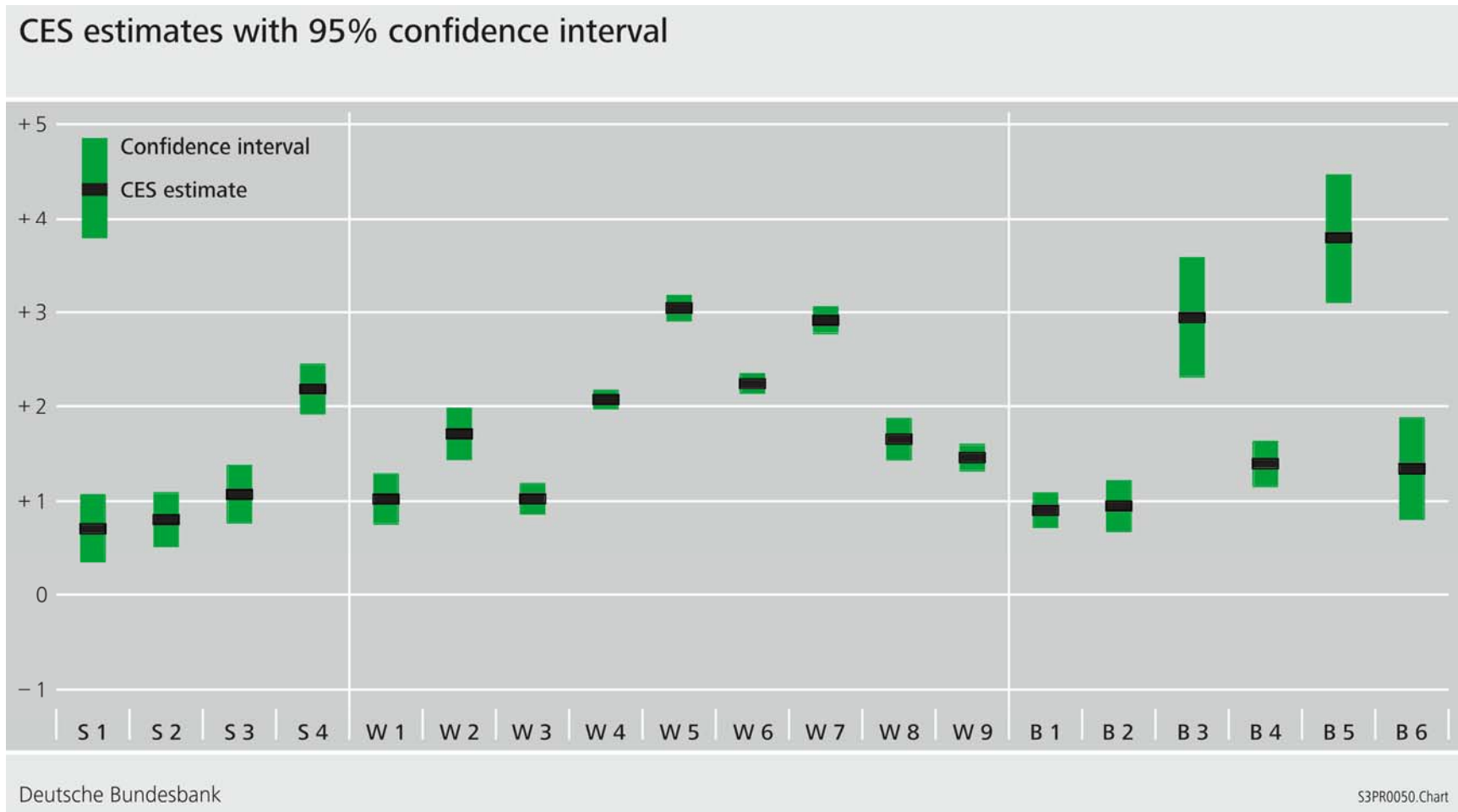
## 5. Empirical results

### Findings on substitution behaviour

- The median elasticity of substitution is 1.5, ranging from .7 to 3.8.
- All estimates are **statistically significantly greater than zero**; for 8 out of 19 sub-classes **the difference to iso-elasticity is insignificant**, while for the remaining 11 sub-classes substitution is found to even exceed unity elasticity.
- **In spirits, consumers are more willing to substitute between different types of whiskey (S 4) than is the case for brandy or vodka (S 1 and S 2).**
- **For both red and white wines, substitution is more pronounced for the New World (W 5 and W 7) than for European wines (W 4 and W 6).**
- **Also, the elasticity of substitution tends to be higher for 12 cans and 20 bottles of lager (B 3 and B 5), respectively, than for 4 packs (B 2 and B 4).**
- These results are **consistent with the findings of Elliott and O’Neill (2012).**
- Furthermore, comparing the CES regression results with the direct calculation of the generalised means, **the outcomes do not change qualitatively.**
- In particular, **the Carli index performs remarkably well** at the elementary level of a Laspeyres price index, questioning the argument of its “upward bias” – in fact, **it is the Jevons index that has a downward bias.**

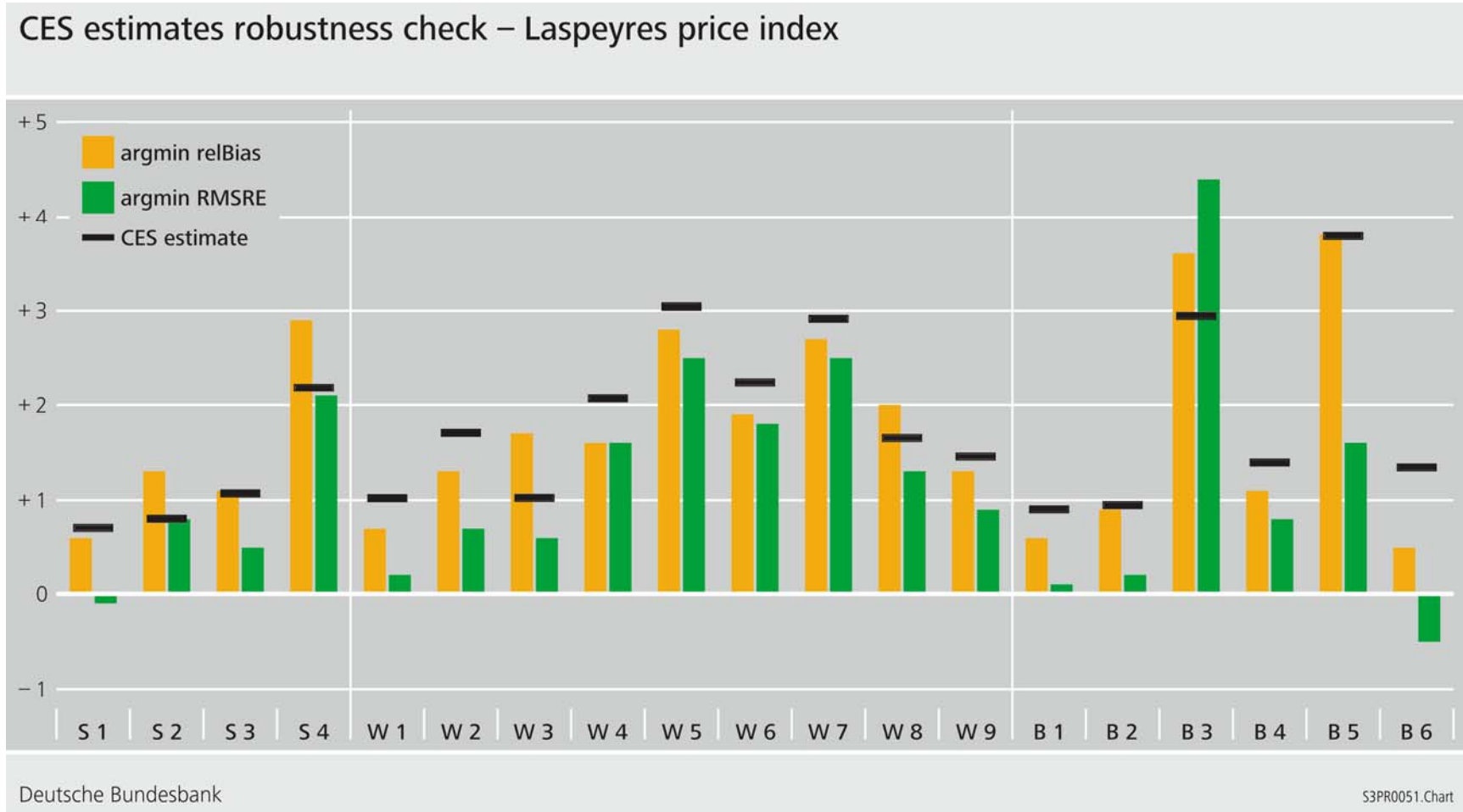
# 5. Empirical results

## CES estimation results



# 5. Empirical results

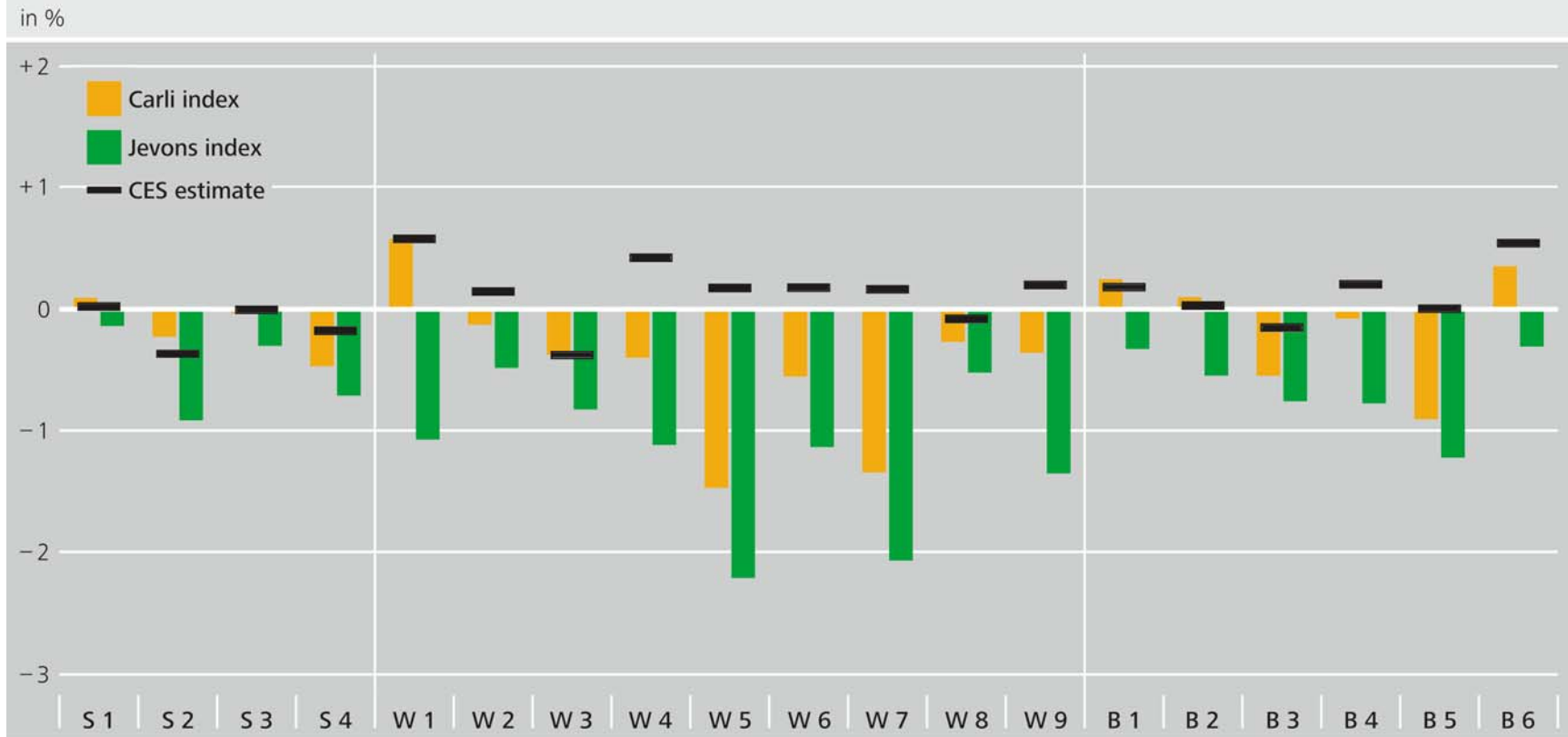
## Laspeyres price index: robustness



# 5. Empirical results

## Laspeyres price index: bias

Relative biases of elementary indices – Laspeyres price index

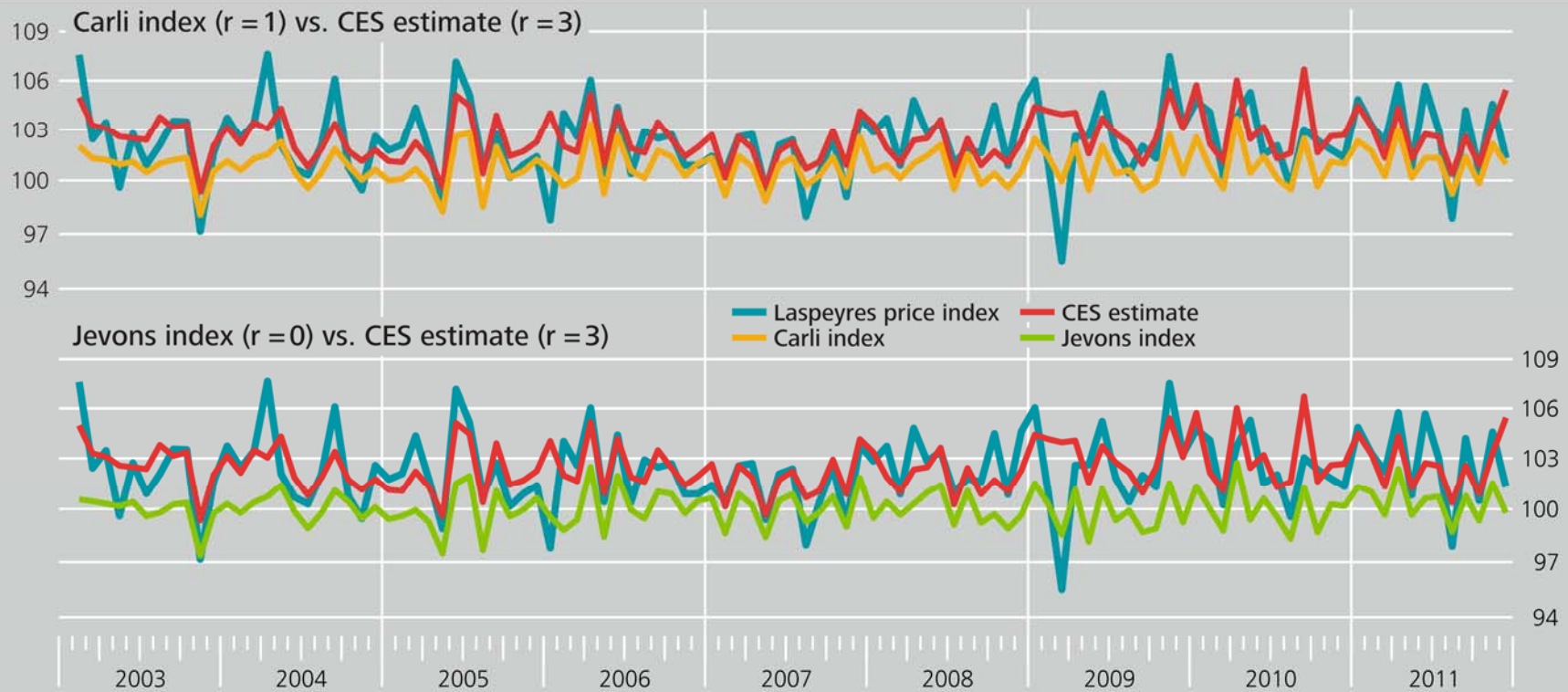


# 5. Empirical results

## Laspeyres price index: time series

Laspeyres price index for W 5 – Red wine (New World)

Previous month = 100, log scale



Deutsche Bundesbank

S3PR0058.Chart

## 6. Discussion

- The problem of aggregational consistency demonstrates the need for a **weighting at the lowest possible level**.
- This would mean that, in the trade-off between **estimated weights/weights from secondary sources** on the one hand and the elementary bias of unweighted indices on the other, the balance would often tip **in favour of weighting**.
- **The biases at the elementary level** can, in some cases, reach such large dimensions that they become **relevant for the aggregate index**.
- There is a **“price” to be paid at the upper level** for suboptimal index formula selection at the lower level; thus, the need for **two-staged price indices to be accurately constructed** becomes obvious.
- **Disaggregation is a panacea!**
  
- Insofar as **no information on weights** is available, **studies on substitution** can help in **guiding the choice of the optimal elementary index** for a given measurement target.
- Often, even an expert judgement on substitutability **outperforms the test approach**.