The upward bias of markups estimated from the price-based methodology

Hervé Boulhol

► To cite this version:

Hervé Boulhol. The upward bias of markups estimated from the price-based methodology. 2005.
halshs-00195883

HAL Id: halshs-00195883

<https://shs.hal.science/halshs-00195883>

Submitted on 11 Dec 2007

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

**The upward bias of markups estimated
from the price-based methodology**

Hervé BOULHOL, IXIS-CIB & TEAM

2005.55

***The Upward Bias of Markups Estimated
from the Price-Based Methodology ****

Hervé Boulhol

IXIS-CIB and TEAM (University Paris I Panthéon-Sorbonne and CNRS)

hboulhol@ixis-cib.com

July 2005

* I am grateful to Lionel Fontagné, Sébastien Jean and Joaquim Oliveira Martins for guidance and time. I would also like to thank David Galvin, Pamina Koenig and Daniel Mirza for their help, and the participants of the seminar at Delta, the OECD and Team for their remarks.

Résumé

Des études précédentes ont souligné que la méthodologie développée par Roeger (1995) conduit à des markups trop élevés. Cette caractéristique est confirmée ici à partir des parts du capital implicites exagérément faibles. Théoriquement, le choix de normalisation, le faible ajustement du capital et les erreurs de mesure des services et du coût du capital entraînent chacun un biais à la hausse. Par exemple, le markup estimé selon cette méthodologie est en fait le markup ajusté par les rendements d'échelle associés aux facteurs variables seulement. Suivant l'analyse empirique, chacune de ces trois sources de surestimation semble jouer un rôle.

Mots clés: Markup, Fixité du capital, Concurrence imparfaite

Abstract

Previous studies have emphasized that Roeger's methodology generates too high markups. This feature is confirmed on the basis of the unrealistically low capital shares implied by the estimates herein. Theoretically, it is shown that the normalization choice, the slow adjustment of capital and the mismeasurement of capital expenditures, each produces an upward bias. For instance, the price-based estimated markup is in fact the markup adjusted for returns to scale on the variable inputs only. Based on the empirical analysis, each of these three sources of overestimation is very likely to play a role.

Keywords: Markup, Capital Fixity, Imperfect Competition

JEL Classification: L11, L13, L60

1. Introduction

Industrial economics is indebted to Hall (1986) for estimating markups at the sectoral levels. Improvements have then been proposed by Basu (1995), who highlights the quantitative importance of paying greater attention to materials, and by Roeger (1995), who derives a new methodology that circumvents intricate endogeneity issues in Hall's approach. The purpose of this study is to contribute to elucidating the puzzle raised by the too high level of markups estimated by Roeger's methodology, and noted in previous studies, including Hindriks, Nieuwenhuijsen and de Wit (2000) and Oliveira Martins (2002). The diagnosis of overestimation is made because the capital shares implied from the estimated markups are unrealistically low, often being even negative.

Normalization issue, capital quasi-fixity and measurement error of capital expenditures, each of these three elements is shown to bias Roeger-type markup upwards. Normalization choice is a well known issue in the cointegration literature. In a nutshell, estimating the Lerner index, from which the markup is deduced, or the markup directly makes a noticeable difference. The econometric relationship is such that the Roeger's original estimate of the Lerner index produces higher markups than its direct estimation.

However, even after accounting for the difference due to the choice of normalization, the puzzle, albeit attenuated, remains. The mismeasurement of the capital services and of the user cost are known to be a serious concern. Under fairly general assumptions, measurement error tends to bias Roeger's markup upwards. Indeed the change in capital expenditures appears on both sides of Roeger's equations and the coefficients applied to each side make the bias caused by mismeasurement an amplification bias.

Without downplaying the contribution of measurement error, the latter does not seem to be sufficient to explain the magnitude of the problem. Indeed, in most of the 129 OECD two-digit series in the sample, Roeger's estimated markup is not significantly different from the upper bound represented by the inverse of the sum of average labor and material shares in output. This stylized fact is consistent with the case of capital fixity. Indeed, when capital is purely fixed, Roeger's estimate does not lead to the

markup over average cost (i.e. the markup over marginal cost if returns to scale are constant) but to markup over the cost of *variable* inputs. Therefore, markup to marginal cost will be overestimated to the extent that the returns to scale on the *variable* factors are decreasing. Although Roeger himself notes that “Hall’s original method for estimating the markup does not require the use of capital costs and may therefore be more robust by allowing for cases in which capital is a true fixed factor of production”, although the slow adjustment of capital is a widespread working hypothesis in both the theoretical and empirical literature, the quantitative impact of quasi-fixity on price-based markup measures has so far been either ignored or underestimated.

Overall, the three causes highlighted above are likely to combine and provide an explanation of the “anomaly” noted by Hindriks et al. The paper is organized as follows. Section 2 presents the primal approach due to Hall and the price-based or dual approach innovatively developed by Roeger. Section 3 addresses the normalization issue, whereas Section 4 treats the case of quasi-fixity. Section 5 assesses the impact of the mismeasurement of capital. Section 6 provides the empirical evidence and finally, Section 7 concludes

2. Hall-type and Roeger-type regressions

The common framework assumes a homogeneous production function:

$$Y = A \cdot F(K, L, M) \quad (1)$$

where Y is output, K capital, L labor, M materials and A a productivity term.

2.1. Primal approach

Noting dz the logarithm differential of any given Z variable and e_i the elasticity of output with respect to factor i , differentiating (1) leads to:

$$dy = e_k \cdot dk + e_l \cdot dl + e_m \cdot dm + da \quad (2)$$

x denoting the returns to scale, Euler’s equation can be expressed in terms of the elasticities:

$$e_k + e_l + e_m = x \quad (3)$$

Substituting in (2) the elasticity of output to capital derived from (3) entails:

$$dy = e_l . (dl - dk) + e_m . (dm - dk) + x . dk + da \quad (4)$$

Finally, using the first order profit maximization conditions on the labor and material inputs, $e_i = \mathbf{m}a_i$ for $i = L, M$, establishes Hall-type specification, where a_i denotes the share of factor i in output and $\mathbf{m}$ the markup to marginal cost:

$$dy = \mathbf{m}[a_L . (dl - dk) + a_M . (dm - dk)] + x . dk + da \quad (5)$$

The important point is that equation (5) is established without assuming that the marginal revenue of capital equates its user cost. Therefore, Hall-type equation is valid even if capital is slow to adjust.

2.2. Price-based or dual approach

Conversely, the price-based approach requires that the first-order condition on capital apply, i.e. $e_K = \mathbf{m}a_K$. It follows from Euler's equation (3) that the factor shares are linked according to:

$$a_K + a_L + a_M = x / \mathbf{m} \quad (6a)$$

$$\text{i.e.} \quad P.Y = \mathbf{n} . (R.K + W.L + Q.M) \quad (6b)$$

where $\mathbf{n} \equiv \mathbf{m} / x$ stands for the markup adjusted for returns to scale, P being the price of output, and R , W and Q the factor prices. As shown by Oliveira Martins, Scarpetta and Pilat (1996), Roeger's specification can be obtained by differentiating (6b) and by using the capital share inferred from (6a):

$$dpy - drk = \mathbf{n} . [a_L . (dwl - drk) + a_M . (dqm - drk)] \quad \text{which is denoted} \quad dx = \mathbf{n} . dz \quad (7)$$

with dx and dz being the respective LHS and RHS variables of equation (7). Roeger's equation links the markup to the sensitivity of the capital share to the changes of relative factor shares. In fact, Roeger estimates a specification equivalent to (7) but expressed in terms of the (adjusted) Lerner index $L = 1 - 1/\mathbf{n}$:

$$(dx - dz) = L . dx \quad (8)$$

What are the comparative advantages of each approach? On the one hand, the main difficulty in Hall's, and that Roeger's avoids, comes from the total factor productivity growth term, da , which is correlated to RHS variables in (5). Estimations should therefore turn to instrumental variables, but finding an efficient and valid instrument is a cumbersome task. Another advantage of Roeger's is that it only requires variables in value terms whereas Hall's needs outputs and materials in volume terms. Moreover, contrary to Hall's, Roeger's specification is unaffected whether the technological change is Harrod-neutral or biased against labor. On the other hand, Hall's methodology allows for the identification of both markup over marginal cost and returns to scale, whereas Roeger's can only estimate their ratio which is the markup over average cost. Moreover, Hall's does not need any computation of rental capital cost. Finally, for our purpose, the main disadvantage of Roeger's might be that, contrary to Hall's, the price-based specification is not robust to the case of capital fixity.

3. Normalization issue

The first reason why Roeger's markups could be biased upwards is linked to a well-known normalization issue in the cointegration analysis (see Hamilton, 1994, p.589). Roeger's methodology based on equation (8) assumes that the cointegrating vector $[(dx-dz), dx]$ is normalized to unity on the first variable. This choice makes a material difference, the more the R^2 is low. Indeed, let us compare Roeger's n - based markup estimated from (7), $dx = n \cdot dz$, which we denote $\hat{n}$, to the original Roeger's estimated from (8), $(dx-dz) = L \cdot dx$, which is written $\hat{n}_L \equiv 1 - 1/\hat{L}$ based on the estimates of the Lerner index $\hat{L}$. We have the following relations based on OLS estimates without a constant term (in practice, adding a constant has no impact as it is not significant):

$$\hat{L} = \frac{\sum dx_t \cdot (dx_t - dz_t)}{\sum dx_t^2} = 1 - \frac{\sum dz_t^2}{\sum dx_t \cdot dz_t} \cdot \frac{(\sum dx_t \cdot dz_t)^2}{\sum dx_t^2 \cdot \sum dz_t^2} = 1 - \frac{R_n^2}{\hat{n}}$$

where R_n^2 is the R-squared from (7). Consequently, it is easy to conclude that the original Roeger's estimates are higher than n - based markups:

$$\hat{n}_L \equiv \frac{1}{1 - \hat{L}} = \frac{\hat{n}}{R_n^2} \Rightarrow \hat{n}_L > \hat{n} \quad (9)$$

Even though, the fit is generally good with an average R_n^2 of 0.98 across the 129 (country x sector) couples in the data described in Section 6, the average L -based markup stands at 1.147 versus 1.123 for the average n -based markup.¹ It is important to realize that the convexity of the relation linking $\hat{n}_L$ to $\hat{L}$ has a very minor offsetting impact. Indeed a Taylor-development around $\hat{L}$ leads to: $E n_L = \hat{n}_L + s^2 / \hat{n}_L^3$, where s^2 is the variance of L , and based on the estimates, the convexity impact $s^2 / \hat{n}_L^3$ averages a negligible 0.001. This normalization issue highlights in fact the endogeneity of Roeger's RHS variable. This problem is also present in the n -based specification (7) because factor inputs are co-determined with output. However, from the spirit of the markup equation, whereby firms choose their price as a markup over cost, the specification (7) is likely to be preferred. In any case, a better answer is given by the approach proposed by Johansen (1988), which is beyond the scope of this study.

4. Capital fixity in the price-based approach

Equation (6b) $PY = n.COST$ holds in fact for $COST$ representing the total cost of the true variable factors used by firms to maximize profits. It is essential at this point to recall the markup equation comes from first order conditions and captures the idea of market power, i.e. the capacity firms have to mark up *variable* costs in setting their prices at the desired level. If capital is fixed, at least in the short run, then costs related to capital will be fixed costs. They will impact overall profitability but will disappear from the markup equation which becomes:

$$PY = n_{fix} (W.L + Q.M) \quad (10)$$

Naturally in this case, the markup is adjusted for returns to scale on the variable factors only: $n_{fix} = m / x_{LM}$.² Differentiating equation (10) leads to Roeger's specification adapted to the case of capital fixity:

¹ Hindriks et al. were the first to note this hierarchy between L - and n -based markups, without elucidating the relationship between the two measures. They concluded that n -based estimate is more reliable because of higher R-squared levels, which is not relevant, and also because it implies more reasonable capital shares, which is (see Section 6).

² Equation (10) is therefore strictly correct only if the production function is homogenous in the labor and material inputs. In the general case where $q \equiv (F_L L + F_M M) / F = x - F_K K / F$ is not constant, after some calculations, whether capital adjusts perfectly or not, one reaches: $dpy = m/q [a_L . dwl + a_M . dp_m m] - dq/q$.

$$dpy = \mathbf{n}_{fix} \cdot [a_L \cdot dwl + a_M \cdot dqm] \quad (11)$$

Based on (10), (11) is equivalent to:

$$dx = \mathbf{n}_{fix} \cdot dz$$

It is essential to note that this applies to the variables dx and dz defined in (7), i.e. including the capital expenditures. This is because the total coefficient on drk in (7) is $[1 - \mathbf{n} \cdot (a_L + a_M)]$ which equals zero in the case of fixity.³ It is therefore immediately clear that, if capital is fixed, even in the short term, the estimate from Roeger's methodology will be $\mathbf{n}_{fix}$, i.e. the markup over total variable cost, and not the markup over average cost, $\mathbf{n}$. This means that, in this case, Roeger's markup is in fact a measure of the so-called price-cost margin defined, as Schmalensee (1989, p.960) reminds us, as the difference between revenue and variable cost, i.e. the sum of labor and material expenditures, over revenue.

Therefore, even if total returns to scale are constant, Roeger's methodology overestimates markups to the extent that the returns to scale on the *variable* factors are decreasing. To make it very clear, consider the Cobb-Douglas case, $Y = K^a L^b M^{1-a-b}$. Roeger's estimates will then result in $\mathbf{m}_R = \mathbf{m}/(1-a)$, and even under perfect competition, Roeger's markups will be greater than unity.

5. Measurement error in the price-based approach

Before turning to the empirical evidence that the slow adjustment of capital biases Roeger's estimates upwards, let us consider an alternative explanation to the puzzle identified: measurement errors of capital services and user costs. Indeed, levels of capital services are difficult to measure and empirically identifying the role of capital in the production function has often proved to be an unfruitful quest. However, it is believed, and difficult to deny, that the growth rate of capital services is easier to grasp. Moreover, Burnside, Eichenbaum and Rebelo (1995) have shown that the cyclical behavior of capital services is underestimated, although the extent of this underestimation relies on the strong assumptions made, as stressed by the discussion following the paper.

³ Based on footnote 2, this means that Roeger's estimates for the case of capital fixity from (10) will only differ insofar as

$\mathbf{q} = x - F_K K / F$ varies with time and that these time changes are correlated with the RHS variable.

Growth rates of capital variables, stock and user cost, are generally constructed by using a measure of the level as the denominator. There is then a serious inconsistency in putting forward a method based on variables expressed in changes, on the grounds that growth rates only can be used and, at the same time, to compute these series from series in levels. Indeed, Klette (1999, footnote 40) wonders about the advantage of estimating equation (8) rather than (6b) directly.⁴ Moreover, it is not so obvious that the imprecision has less impact on estimates based on methods using growth rates than on those using levels. In any case, the intent is not to focus on this argument. However, such a reasoning is much less convincing when applied to the user cost of capital. $\Delta R/R$ can indeed be extremely volatile, especially as R is low (consider real interest rates during the oil crisis), and therefore there is little reason to believe that $\Delta RK/RK$ is better measured than RK .

The main objective in this section is to assess how measurement issues matter for the markup estimates based on the price-based approach. To separate the issues and because we think in terms of an alternative explanation, only the case of capital adjusting perfectly is considered.

Start from equation (7) $dx = \mathbf{n} \cdot dz$ where the RHS variable is observed with a measurement error due to the capital variable drk , an asterisk indicating an unobserved true variable:

$$dz = dz^* + u \quad (12)$$

Classically, the error u is assumed to be independent of dz^* : $E(u \cdot dz^*) = 0 \Rightarrow E(u \cdot dz) = E(u^2) \equiv \sigma_u^2$

Equation (12) implies that $drk = drk^* - u/(a_L + a_M)$ and therefore the observed dependent variable is:

$$dx = dx^* + u/(a_L + a_M) \quad (13)$$

The true relation $dx^* = \mathbf{n} \cdot dz^* + \mathbf{e}$ is now:

$$dx = \mathbf{n} \cdot dz + \left(\frac{1}{a_L + a_M} - \mathbf{n} \right) u + \mathbf{e} \quad (14)$$

Denoting $\mathbf{n}_{fix} = E(1/(a_L + a_M))$, the markup if capital were a fixed factor, and the residual

$\mathbf{z} = 1/(a_L + a_M) - \mathbf{n}_{fix}$, equation (14) becomes:

⁴ More generally and related to the general focus es here, Klette (1998) highlights that "From (6b) we can directly calculate the markup, given the assumptions maintained by Roeger that (i) constant returns to scale prevail, (ii) we can impute the rental costs for capital, and (iii) capital is fully adjusted to the rental costs" (p.7).

$$dx = n.dz + (n_{fix} - n)u + z.u + e$$

By assuming that the error terms e and z are independent of dz , and noting n_R Roeger's n -based markup, one gets:

$$\text{plim } n_R = n + (n_{fix} - n)q \quad (15)$$

$$\text{where } 0 < q = \frac{s_u^2}{\text{plim } (dz^*)^2 + s_u^2} < 1 \quad (16)$$

The impact of measurement error of the capital variables on Roeger's estimated markup is reflected by q . n_R is unbiased only if $q = 0$, but because n_{fix} is an upper bound to the true markup n (due to capital expenditures), Roeger's markup is biased upwards and towards n_{fix} . As drk is a component of the dependent variable (with coefficient -1: $dx \equiv dpy - drk$), the measurement error bias turns out to be an *amplification* bias: $n < n_R < n_{fix}$.

In order, to establish the relation (15), the classical independence of the measurement error with dz^* is critical. However, a less stringent assumption leads to a similar result. Indeed if, instead of $E(u.dz) = E(u^2) \equiv s_u^2$, the following reasonable inequalities apply: $E(u.dz) > 0$ and $E(dz.dz^*) > 0$, then the relation (15) holds with $0 < q = E(u.dz) / (E(u.dz) + (E(dz.dz^*))) < 1$, with the same interpretation of q as indicating the degree of measurement error.

6. Empirical evidence

Data for this study is from the OECD STAN database and is described in the Appendix. It covers two-digit industries of thirteen OECD countries between 1970 and 2000, that is 129 (country x sector) series in total. The estimated n -based markup from equation (7), $\hat{n}_R$, will now be showed to overestimate markups adjusted for total returns to scale. Given the econometric relationships established in Section 3, this overestimation extends *a fortiori* to the original Roeger L -based markup from (8) due to the normalization issue.

6.1. Confirming that markups are too large in the price-based approach

The estimated markup from the equation in level (6b) is denoted $\hat{n}_{level}$. Aside from any measurement issue, when capital adjusts perfectly, both n_R and n_{level} provide an unbiased estimate of the true markup n . Note that $\hat{n}_{level}$ is a weighted average of the observed markups $v_t = PROD_t / COST_t$ for time t . Indeed, it is straightforward that:

$$\hat{n}_{level} = \frac{\sum COST_t \cdot PROD_t}{\sum COST_t^2} = \sum w_t n_t, \text{ where } w_t = COST_t^2 / (\sum COST_t^2)$$

Empirically, as $\hat{n}_{level}$ is very close to the (unweighted) average of the observed markups, the estimates will be compared to $\hat{n}_{level}$ only.

With US manufacturing sectors as an illustrative example, Table 1 shows that Roeger's estimates are much greater than the estimated $\hat{n}_{level}$, for which Durbin-Watson statistics indicate the need to correct for auto-correlation, although once done, the estimates do not change much.⁵ Roeger's markups are greater than the average level in 11 out of 14 sectors, being perceptibly lower in 1 sector only, and Roeger's average stands at 5.1 points above the average level.

As can be read from Table 2, this issue proves recalcitrant to very different assumptions for computation of capital data, referring to depreciation, interest rates and initial capital stock.⁶ Moreover, the capital share in total output, based on the favored computation of capital stock and rental cost – the first one in table 2 used to produce table 1 –, varies from 3.6% for “Leather products and footwear” to 9.8% for “Basic metals” on average over the period, mismeasurement is likely to account, only partially, for the magnitude of the problem.

Figure 1A plots for each of the 129 (country x sector) couples the difference between $\hat{n}_R$ and $\hat{n}_{level}$. This difference averages a high 7.8 points, the gap between the respective average of 1.123 and 1.045: in other words, margins calculated from the same series appear almost three times larger in the price-based approach. In Figure 1B, the (country x sector) couples are sorted according to the size of

⁵ Estimates are produced from an AR(2) process for the residuals, which corrects for auto-correlation successfully.

⁶ I tested more extreme assumptions with a similar outcome overall.

the difference. The latter is negative in eight cases only, and is in the (0.025;0.150) range for three quarters of the 129 sectors.

Obviously, it does not yet prove that the price-based approach markups are biased upwards. Indeed, if true capital stocks - Sub-section 6.4. extends the discussion around the notion of capital services - are only proportional and not equal to capital stocks, $\hat{n}_{level}$ will be biased. The important point is that $\hat{n}_R$ is just too high in absolute terms, as shown in the following, independent of the possibility that $\hat{n}_{level}$ underestimates the true markup.

The fact that Roeger-type markups seem too large has been highlighted by other studies based on different database. Among those studies, Hindriks et al. note that inferred capital shares from Roeger's estimates are unrealistically low as a large proportion run into negative territory. Table 3 compares effective capital shares with those inferred from $a_K = 1/\hat{n} - a_L - a_M$ and indicates the frequency of negative occurrences. Roeger's estimates lead to inferred capital shares very close to zero on average (1.8% of output, against 6.1% in the data and 5.8% inferred from the equation in level, based on the first capital series) and negative for 43% of the 334 observations available for the USA. Note that these results are not very sensitive to the choice of the method for computing capital data, even though the two selected for illustration purposes – the first and third from table 2 – generate important variations in capital share measures. As these different studies rely on different computations of capital expenditures, this piece of evidence seems to support the fixity assumption rather than the measurement error assumption better.

6.2. The case of capital fixity

We now replicate the exercise above under the assumption of capital fixity, that is we compare $\hat{n}_R^{fix}$ from equation (11) to $\hat{n}_{level}^{fix}$ from equation (10). Figure 2A plots the difference in the two estimates for each series in a similar way to Figure 1A. Anticipating the formal testing in Sub-section 6.3., the difference between the two estimates is rarely significant and the average difference is -0.9 point. This reveals that the capital series create noise in the “perfectly adjusting” case. However, the extent of that noise suggests that mismeasurement is only part of the story.

Indeed, it is noteworthy that $\mathbf{n}_R$ and $\mathbf{n}_R^{fix}$ give on average the same estimates, 1.123 and 1.120 respectively, as displayed in Figure 2B. This means that, despite the fact that $\mathbf{n}_R$ is not sensitive to capital stock series within a multiplicative factor, drk seems to play no role in the price-based markup.

As a result, the markup estimated under the fixity assumption from the equation in level, $\hat{\mathbf{n}}_{level}^{fix}$, is very close to Roeger's $\mathbf{n}$ - based estimated markup, $\hat{\mathbf{n}}_R$. Figure 3 plots the distribution of the difference across the 129 series. The average difference is a negligible -0.3 point and the absolute difference is lower than 2.5 points for 50% of the series, and lower than 5 points for 75%. This is a strong result since $\mathbf{n}_{level}^{fix}$ represents an upper bound for any markup estimate, i.e. whatever the assumptions made. Consequently, it is also no surprise that Roeger's implied capital shares come out close to zero on average.

6.3. Formal testing

The first test bluntly assesses whether equation (10) makes more sense than equation (6b). From the following specification:

$$P.Y = \mathbf{n}.(W.L + Q.M) + h\mathbf{n}.R.K + u \quad (17)$$

If the parameter h is not significantly different from 0 then the assumption that capital is a quasi-fixed factor cannot be rejected. At the 95% (90% respectively) confidence level, the parameter h , is significantly positive in only 23% (28% resp.) of the 129 sectors tested: stated differently, the fixity of capital cannot be rejected in 77% (72% resp.) of the cases. Moreover, this result is robust to various measures of capital stock and cost.

Table 4 and Figure 4 illustrate these results for the USA. Column 3 gives the average markup level in the case of capital fixity: as is apparent the systematic spread with Roeger's disappears. Then, the estimates of equation (17) are successively reported, first bounding h between 0 and 1, and lastly relaxing the constraints. On average, the h parameter takes a value of 0.34 and 0.22 respectively and is almost never significantly different from 0, suggesting a very low speed of capital adjustment to the optimal level. Moreover, the average difference between the unbounded estimate and Roeger's mostly vanishes, and the average absolute difference (not reported here) is more than halved. Supportively, it

is remarkable that when the initial spread between Roeger's and level equation estimates (first two columns) is high, the capital fixity estimate, $\hat{n}_{level}^{fix}$ in the third column, or the very similar unbounded version, brings markups closer towards Roeger's.

More importantly and more formally, the null hypothesis that the parameters n_{level} , n_R , n_{level}^{fix} and n_R^{fix} estimated from equations (6B), (7), (10) and (11) respectively are equal is tested, and results are reported in Table 5. At the 5% level, the equality $n_{level} = n_R$ is rejected for 78 of the 129 time series. The number of rejections falls to 18 in the fixity case ($H0: n_{level}^{fix} = n_R^{fix}$). More strikingly, the null hypothesis that Roeger's markup n_R equals the upper bound n_{level}^{fix} is rejected in only 5 (15 respectively) sectors at the 1% level (10% respectively). These results are strong evidence of both the fixity assumption and the overestimation of Roeger-type markups.

6.4. Coming back on the mismeasurement of capital services

One of the most convincing illustrations regarding the importance of properly measuring capital services, especially through the cycle, is provided by Shapiro (1993) and Burnside et al. In both cases, the idea is that true capital services, K^* , should take into account the workweek of capital, Ψ , so that:

$$K^* = \Psi.K$$

which entails $dk^* = d\psi + dk$

This fits well within the framework developed in Section 4, with $u = (a_L + a_M).d\psi$, and is most likely to bias Roeger's estimate towards n_{fix} , the extent of the bias depending on the correlation between $d\psi$ and dz . However, the bias ought not to be as large as given by q in equation (16). The deep reason is that the approach relies on a price-based specification. The concept of the workweek of capital is perfectly designed for the measurement of total factor productivity. However, this will have an impact in Roeger-type equation only to the extent that additional usage of capital is more costly. In other words, the impact of the underestimation of the changes in capital services is attenuated as concerns the estimated price-based markup because $|d(rk)^* - d(rk)| < |d\psi|$. As Shapiro put it p.232: whether it has an impact "will depend on what the firm pays for increasing hours (*of capital usage, my precision*).

[...] Simple calculations based on average shift premia suggest that the incremental cost of using capital at night is quite low. If this is the case, then the share of capital hours in cost would be low”.

7. Conclusion

The purpose of this study was to understand why markups estimated by Roeger’s methodology seem too high, as pointed out by other studies. Normalization, i.e. the choice of which variable is the dependent in the cointegrating relationship, was shown to be one of the reasons. However, this covers only a part of the problem. Additionally, the slow adjustment of capital and the mismeasurement of capital expenditures both tend to bias price-based markups upwards.

Moreover, measurement error alone could hardly account for the magnitude of the overestimation, suggesting the three explanations combine. Finally, abstracting from mismeasurement, in the case of capital fixity, which finds strong empirical support, Roeger’s estimation leads to the markup adjusted for returns to scale on the *variable* inputs only. Therefore, markup to marginal cost will be overestimated to the extent that returns to scale on the *variable* factors are decreasing, a much more likely possibility than the decreasing of the returns to scale on all production factors. This elucidates the puzzling outcomes of previous studies pointing at negative capital shares wrongly inferred from markup estimates.

Appendix: Data description

Data covers thirteen OECD countries: Austria, Belgium, Canada, Denmark, Finland, France, Italy, Japan, Netherlands, Norway, Sweden, United Kingdom and United States. Two samples have been built covering manufacturing industries at the two-digit level for the period 1970-2000 (International Standard Industrial Classification (ISIC), third revision). One has more detailed information but is sparse, as some sectors are missing for a number of countries, and is composed of 138 time series (a country-sector crossing). The other contains more aggregated data but is more balanced with 129 annual time series available out of a total of 143. Sector identification is given in Table A1. Note that the averages across sectors presented in the following tables are unweighted, i.e. treating each equally, because our prime interest lies in the mechanisms at work rather than in the impact for the total economy.

Sectoral data come from the OECD Structural Analysis (STAN) Database. Table A1 details the 23 manufacturing sectors.

Variables

PROD: Production (Gross Output) at current prices ($P.Y$ in the text)

LABR: Labor compensation of employees ($W.L$ in the text)

VALU: Value added at current prices.

VALUB: Value added at basic prices. When VALUB is available, $P.Y = PROD - VALU + VALUB$.

Materials: $QM = PROD - VALU$.

Capital

The price of capital, p_k , used in the study is the price of investment calculated from the Gross Fixed Capital Formation at current prices (GFCF) and in volume (GFCFK). When data is not available, the price of the GDP deflator (source OECD Economic Outlook) is chosen for p_k . The user cost of capital is calculated classically according to: $R = p_k \cdot (r + d - \dot{p}_k^a)$, where r is the interest rate, d the depreciation rate and $\dot{p}_k^a$ is the expected relative change in the price of capital. By default, r was chosen as the long-term interest rate (but an alternative with short-term rate was also tested), the depreciation was fixed at 0.05 (but 0.07 was also tested, see below) and $\dot{p}_k^a$ was set at the average of the price change over the last three years.

Net capital stock (NCAPK) is available directly in the data for Belgium and Italy only. For the other countries, I calculated the series based on the Gross Fixed Capital Formation in volume (GFCFK) according to: $K_t = (1-d) \cdot K_{t-1} + GFCFK_t$. Only, the starting point value for the net capital stock is missing to build the series. It was derived differently depending on the countries, due to data availability. For Austria, Finland, Japan, Norway and the USA, I used the Consumption of Fixed Capital (CFC) and inferred: $p_{k0} \cdot K_0 = CFC_0 / d$ for the first date. For Canada, France, the UK, the Netherlands and Sweden, I computed $p_{k0} \cdot K_0 = c \cdot VALU_0 \cdot q$. c is the average, for each sector across countries for which the gross capital stock (CAPK) is available, of $p_k \cdot CAPK / VALU$ and is reported in table A2. The parameter q reflects the ratio of net capital stock to gross capital stock. I ran simulations based on various methodologies (double-decline, geometric, hyperbolic, see OECD, 2001) and reasonable values of parameters to arrive at a ratio of between 0.50 and 0.85. I chose $q = 0.70$ by default, but compared the results with $q = 0.55$. Finally, as Denmark provides gross capital stock only, I used the constant ratio q to deduce net capital stock for all dates.

I shall now detail the various computations used for the case of the USA as they appear in Table 2. $K1$ was calculated, as described above, from the investment flows, a depreciation rate d of 0.05 and an initial capital stock derived from $p_{k0} \cdot K_0 = CFC_0 / d$. $K2$ was calculated similarly but using $d = 0.07$. With the idea of testing extreme assumptions, $K3$ was bluntly derived from $p_{kt} \cdot K_t = CFC_t / d$ for every date t and $d = 0.05$. $K4$ was calculated as $K3$ but with $d = 0.07$. I also tested as r , the average of the short-term and the long-term rates, and even a constant for the real interest rate.

References

- Basu S., 1995. 'Intermediate goods and business cycles: implications for productivity and welfare'. *American Economic Review*, 85, June, 512-531.
- Burnside C., Eichenbaum M., Rebelo S., 1995. 'Capacity Utilization and Returns to Scale'. *NBER Macroeconomics Annual*, 67-124, Bernanke B.S. and Rotemberg J.J. (eds), MIT Press.
- Hall R.E., 1986. 'Market structure and macroeconomic fluctuations'. *Brooking Papers on Economic Activity* 2, 285-322.
- Hamilton J.D., 1994. *Time Series Analysis*. Princeton University Press.
- Hindriks F., Nieuwenhuijsen H., de Wit G., 2000. 'Comparative advantages in estimating markups'. *EIM/SCALES Research Report*, 0003/E.
- Johansen S., 1988. 'Statistical Analysis of Cointegrating Vectors'. *Journal of Economic Dynamics and Control*, 12, 231-254.
- Klette T.J., 1998. 'Market Power, Scale Economies and Productivity: Estimates from a Panel of Establishment Data'. Memorandum no. 15/98. Department of Economics, University of Oslo.
- Klette T.J., 1999. 'Market Power, Scale Economies and Productivity: Estimates from a Panel of Establishment Data'. *Journal of Industrial Economics*, 4, 451-476.
- OECD, 2001. *Measuring capital*. Available at www.oecd.org.
- Oliveira Martins J., Scarpetta S., Pilat D., 1996. 'Mark-up ratios in manufacturing industries: estimates for 14 OECD countries'. *OECD Working Paper*, 162.
- Oliveira Martins J., 2002. 'Mark-ups as an indicator of the degree of competition on product markets: an overview'. Mimeo.
- Roeger W., 1995. 'Can imperfect competition explain the difference between primal and dual productivity measures? Estimates for U.S. manufacturing'. *Journal of Political Economy*, 103 (2), 316-330.
- Schmalensee R., 1989. 'Inter-industry studies of structure and performance'. *Handbook of International Organisation*. Chapter 16, 951-1009.
- Shapiro M.D., 1993. 'Cyclical Productivity and the Work week of Capital'. *American Economic Review, Papers and Proceedings*, 83 (2), 229-233.

Figure 1A

Difference between Roeger-type Markup and (weighted) Average Markup Level*

$$\hat{\pi}_R - \hat{\pi}_{level} \quad (\text{Equations 6b and 7})$$

Average difference = 0.078

(*): Each square represents one of the 129 (country x sector) couples

Figure 1B

Distribution of the Difference between Roeger-type Markup

and (weighted) Average Markup Level, $\hat{\pi}_R - \hat{\pi}_{level}$

(% of the 129 sectors)

Difference between Roeger-type Markup and (weighted) Average Markup Level

Figure 2A

Case of Capital Fixity

Difference between Roeger-type Markup and (weighted) Average Markup Level*

$$\hat{n}_R^{fix} - \hat{n}_{level}^{fix} \quad (\text{Equations 10 and 11})$$

Average difference = -0.009

Figure 2B

Difference between Roeger-type Markups*

Perfectly adjusting case vs capital fixity case, $\hat{n}_R^{fix} - \hat{n}_R$ (Equations 7 and 11)

Average difference = -0.003

(*): Each square represents one of the 129 (country x sector) couples

Figure 3

**Distribution of the Difference between Roeger-type Markup
and (weighted) Average Markup Level in the Fixity Case**

$$\hat{\pi}_R - \hat{\pi}_{fix}^{level}$$

(% of the 129 sectors)

Figure 4

Comparison between Markup Estimates (see Table 4)

USA two-digit Sectors

(weighted) average markup level $\hat{\mu}_{level}$ (equation 6b), Roeger's markup $\hat{\mu}_R$ (equation 7),

(weighted) average markup level in the fixity case $\hat{\mu}_{fix}^{level}$ (equation 10)

Table 1
Difference between Roeger's Markups and (weighted) Average Markup Levels
USA two-digit sectors, 1970-2000

			Level equation (6b) (OLS)		Level equation (6b) (AR2)*		Roeger's equation (7) (OLS)			Roeger's – level diffe- rence
Country		ISIC Rev.3	$\hat{n}_{level}$	Durbin- Watson	$\hat{n}_{level}$	std	$\hat{n}_R$	std	Durbin- Watson	
usa	15	Food and Beverages	1.057	0.408	1.024	0.051	1.076	0.020	2.399	0,052
usa	16	Tobacco	1.130	0.970	1.124	0.029	1.227	0.041	1.667	0,103
usa	19	Leather and Footwear	1.125	0.448	1.039	0.074	1.023	0.043	2.534	-0,016
usa	20	Wood and Cork	1.098	0.720	1.096	0.011	1.219	0.036	1.885	0,122
usa	21	Pulp and Paper	1.031	0.900	1.032	0.009	1.154	0.031	1.835	0,122
usa	22	Printing and Publishing	1.075	1.045	1.075	0.007	1.140	0.035	2.799	0,065
usa	23	Coke, Ref.Petrol., Nuclear Fuel	1.041	0.615	1.037	0.018	1.026	0.033	2.194	-0,010
usa	24	Chemicals	1.126	0.133	1.143	0.040	1.169	0.032	1.438	0,026
usa	25	Rubber and Plastic	1.018	0.606	1.019	0.011	1.065	0.018	2.464	0,046
usa	26	Other Non-Metallic Mineral	1.022	0.296	1.038	0.034	1.155	0.028	2.167	0,117
usa	27	Basic Metals	0.971	0.467	1.047	0.082	1.125	0.052	2.863	0,078
usa	28	Fabricated Metal	1.080	0.162	1.078	0.013	1.105	0.021	1.263	0,027
usa	34	Motor Vehicles and Trailers	1.040	0.283	1.062	0.024	1.091	0.073	1.824	0,029
usa	35	Other Transport Equipment	0.973	1.027	0.974	0.007	0.925	0.096	2.326	-0,048
mean			1.056		1.056	0.029	1.107	0.040		0.051

(*): Estimates are produced from an AR(2) process for the residuals, which corrects for auto-correlation successfully. Standard deviations are robust to heteroscedasticity and autocorrelation.

Equation (6b): $P.Y = \mathbf{n}_{level} \cdot (R.K + W.L + Q.M)$

Equation (7): $dpy - drk = \mathbf{n}_R \cdot [a_L \cdot (dwl - drk) + a_M \cdot (dqm - drk)]$

Table 2
Robustness of the Difference across Different Measures of Capital Services and Cost*
USA two-digit sectors, 1970-2000

		Level equation markup estimates				Difference (Roeger's – level)				Average capital share of output			
		$\hat{\pi}_{level}$				$\hat{\pi}_R - \hat{\pi}_{level}$							
sector		K1	K2	K3	K4	K1	K2	K3	K4	K1	K2	K3	K4
usa	15	1.024	1.025	1.028	1.039	0.052	0.046	0.076	0.067	0.041	0.037	0.065	0.056
usa	16	1.124	1.285	1.090	1.103	0.103	-0.056	0.162	0.150	0.038	0.035	0.066	0.056
usa	19	1.039	1.038	1.053	1.072	-0.016	-0.034	0.086	0.069	0.036	0.031	0.093	0.078
usa	20	1.096	1.106	1.029	1.048	0.122	0.127	0.165	0.150	0.059	0.053	0.108	0.094
usa	21	1.032	1.038	1.015	1.031	0.122	0.127	0.105	0.089	0.086	0.081	0.095	0.082
usa	22	1.075	1.079	1.078	1.090	0.065	0.050	0.027	0.013	0.053	0.049	0.062	0.052
usa	23	1.037	1.039	1.030	1.038	-0.010	-0.017	0.045	0.037	0.049	0.045	0.056	0.048
usa	24	1.143	1.147	1.046	1.076	0.026	0.022	0.123	0.092	0.085	0.078	0.140	0.119
usa	25	1.019	1.022	1.015	1.025	0.046	0.038	0.020	-0.001	0.059	0.056	0.056	0.048
usa	26	1.038	1.050	1.027	1.044	0.117	0.115	0.117	0.102	0.085	0.077	0.084	0.072
usa	27	1.047	1.055	1.000	1.009	0.078	0.080	0.045	0.034	0.098	0.082	0.073	0.063
usa	28	1.078	1.083	1.040	1.056	0.027	0.019	0.064	0.046	0.052	0.047	0.082	0.069
usa	34	1.062	1.065	1.019	1.042	0.029	0.033	0.055	0.035	0.056	0.050	0.158	0.136
usa	35	0.974	0.979	1.003	1.008	-0.048	-0.083	0.018	0.013	0.057	0.050	0.030	0.025
mean		1.056	1.072	1.034	1.049	0.051	0.034	0.079	0.064	0.061	0.055	0.083	0.071
difference / capital share correlation						<i>0.40</i>	<i>0.62</i>	<i>0.42</i>	<i>0.34</i>				

(*) Capital variables are described in the Appendix. Sector description is given in Table 1.

Note

The last row of the table computes the linear correlation coefficient between the difference in the estimates $\hat{\pi}_R - \hat{\pi}_{level}$ (second part of the table) and the average capital share from the data, for each capital series respectively. The distinct positive correlation is consistent with the theoretical relationship found when capital is fixed in the Cobb-Douglas case (at the end of Section 4), whereby the difference is positively related to a , the long term capital share in total cost.

Table 3

Implied Capital Shares from $a_K = 1/\hat{n} - a_L - a_M$

USA two-digit sectors, 1970-2000

			Capital computation : K1						Capital computation : K3				
		Frequency of Labor +Materials shares greater than 1	Frequency of negative implied capital share		Average capital share			Frequency of negative implied capital share		Average capital share			
Coun- try	Sec- tor		level	Roeger									
		data	$\hat{n}_{level}$	$\hat{n}_R$	data	level	Roeger	level	Roeger	data	level	Roeger	
usa	15	0.00	0.00	0.21	0.041	0.066	0.018	0.00	0.52	0.065	0.062	-0.004	
usa	16	0.00	0.04	0.71	0.038	0.069	-0.006	0.00	0.78	0.066	0.097	-0.024	
usa	19	0.00	0.00	0.00	0.036	0.112	0.126	0.00	0.39	0.093	0.099	0.030	
usa	20	0.00	0.00	0.87	0.059	0.063	-0.029	0.00	0.73	0.108	0.122	-0.012	
usa	21	0.00	0.00	0.83	0.086	0.083	-0.020	0.00	0.39	0.095	0.099	0.007	
usa	22	0.00	0.00	0.25	0.053	0.060	0.007	0.00	0.00	0.062	0.058	0.034	
usa	23	0.00	0.08	0.00	0.049	0.057	0.067	0.00	0.35	0.056	0.064	0.026	
usa	24	0.00	0.04	0.42	0.085	0.050	0.030	0.00	0.39	0.140	0.130	0.031	
usa	25	0.00	0.00	0.13	0.059	0.054	0.012	0.00	0.00	0.056	0.058	0.039	
usa	26	0.00	0.03	0.87	0.085	0.066	-0.032	0.03	0.77	0.084	0.076	-0.024	
usa	27	0.00	0.17	1.00	0.098	0.019	-0.047	0.00	0.13	0.073	0.063	0.020	
usa	28	0.00	0.00	0.29	0.052	0.045	0.023	0.00	0.26	0.082	0.079	0.024	
usa	34	0.00	0.21	0.42	0.056	0.020	-0.004	0.04	0.35	0.158	0.061	0.009	
usa	35	0.21	0.13	0.04	0.057	0.047	0.101	0.21	0.26	0.030	0.017	0.000	
mean		0.015	0.050	0.430	0.061	0.058	0.018	0.020	0.380	0.083	0.077	0.011	

Table 4
Blunt Test of the Capital Fixity Assumption

$$P.Y = \mathbf{n} \cdot (W.L + Q.M) + h\mathbf{n} \cdot R.K + u$$

country	sector	level AR(2) $h = 1$ (1)	Roeger' s (2)	level AR(2) $h = 0$ (3)	s.d.	level AR(2) $0 < h < 1$ (4)			level AR(2) unbounded h (5)		
		$\hat{n}_{level}$	$\hat{n}_R$	$\hat{n}_{level}^{fix}$		$\mathbf{n}$	h	s.d. (h)	$\mathbf{n}$	h	s.d. (h)
usa	15	1.024	1.076	1.049	0.048	1.043	0.25	0.37	1.043	0.25	0.37
usa	16	1.124	1.227	1.171	0.054	1.145	0.57	1.10	1.145	0.57	1.10
usa	19	1.039	1.023	1.050	0.076	1.039	1.00	0.00	1.037	1.26	1.56
usa	20	1.096	1.219	1.170	0.014	1.170	0.00	0.00	1.187	-0.22	0.39
usa	21	1.032	1.154	1.141	0.010	1.140	0.00	0.00	1.180	-0.33	0.22
usa	22	1.075	1.140	1.146	0.005	1.141	0.07	0.51	1.141	0.07	0.51
usa	23	1.037	1.026	1.027	0.027	1.027	0.00	0.00	1.042	-0.93	0.84
usa	24	1.143	1.169	1.158	0.049	1.149	0.18	0.35	1.149	0.18	0.35
usa	25	1.019	1.065	1.038	0.038	1.029	0.20	0.32	1.029	0.20	0.32
usa	26	1.038	1.155	1.084	0.064	1.084	0.00	0.00	1.098	-0.21	0.37
usa	27	1.047	1.125	1.073	0.016	1.073	0.00	0.00	1.123	-0.44	0.09
usa	28	1.078	1.105	1.100	0.021	1.080	0.96	0.33	1.080	0.96	0.33
usa	34	1.062	1.091	1.110	0.018	1.081	0.56	0.60	1.081	0.56	0.60
usa	35	0.974	0.925	1.032	0.009	0.974	1.00	0.00	0.932	1.79	1.05
mean		1.056	1.107	1.096	0.032	1.084	0.34		1.091	0.22	

Table 5

Formal Tests:*

Number of sectors for which the equality of the parameters can be rejected
out of the 129 (country x sector) time series

Null Hypothesis H_0	Significance level		
	1%	5%	10%
$n_{level} = n_R$	56	78	89
$n_{level}^{fix} = n_R^{fix}$	9	18	25
$n_R = n_R^{fix}$	0	4	13
$n_{level}^{fix} = n_R$	5	14	15
$n_{level}^{fix} = n_{level}$	76	89	96

(*): Standard deviations used are robust to heteroscedasticity and autocorrelation.

Equations

$$P.Y = n_{level} \cdot (R.K + W.L + Q.M) \quad (6b)$$

$$dpy - drk = n_R \cdot [a_L \cdot (dwl - drk) + a_M \cdot (dqm - drk)] \quad (7)$$

$$P.Y = n_{level}^{fix} \cdot (W.L + Q.M) \quad (10)$$

$$dpy = n_R^{fix} \cdot [a_L \cdot dwl + a_M \cdot dqm] \quad (11)$$

Reading: The null hypothesis that the markup estimated from the equation in level (6b) equals the markup estimated from the price-based equation (7) is rejected in 78 sectors out of the 129 in the sample at the 5% significance level.

Table A1: ISIC Rev. 3 Classification

Sector description		More aggregated sample	
15	FOOD PRODUCTS AND BEVERAGES	15-16	FOOD PRODUCTS, BEVERAGES AND TOBACCO
16	TOBACCO PRODUCTS	17-19	TEXTILES, TEXTILE PRODUCTS, LEATHER AND FOOTWEAR
17	TEXTILES	20	WOOD AND PRODUCTS OF WOOD AND CORK
18	WEARING APPAREL, DRESSING, DYING OF FUR	21-22	PULP, PAPER, PAPER PRODUCTS, PRINTING AND PUBLISHING
19	LEATHER, LEATHER PRODUCTS AND FOOTWEAR	23-25	CHEMICAL, RUBBER, PLASTICS AND FUEL PRODUCTS
20	WOOD AND PRODUCTS OF WOOD AND CORK	26	OTHER NON-METALLIC MINERAL PRODUCTS
21	PULP, PAPER AND PAPER PRODUCTS	27-28	BASIC METALS AND FABRICATED METAL PRODUCTS
22	PRINTING AND PUBLISHING	29	MACHINERY AND EQUIPMENT, N.E.C.
23	COKE, REFINED PETROLEUM PRODUCTS AND NUCLEAR FUEL	30-33	ELECTRICAL AND OPTICAL EQUIPMENT
24	CHEMICALS AND CHEMICAL PRODUCTS	34-35	TRANSPORT EQUIPMENT
25	RUBBER AND PLASTICS PRODUCTS	36-37	MANUFACTURING NEC; RECYCLING
26	OTHER NON-METALLIC MINERAL PRODUCTS		
27	BASIC METALS		
28	FABRICATED METAL PRODUCTS, except machinery and equipment		
29	MACHINERY AND EQUIPMENT, N.E.C.		
30	OFFICE, ACCOUNTING AND COMPUTING MACHINERY		
31	ELECTRICAL MACHINERY AND APPARATUS, NEC		
32	RADIO, TELEVISION AND COMMUNICATION EQUIPMENT		
33	MEDICAL, PRECISION AND OPTICAL INSTRUMENTS		
34	MOTOR VEHICLES, TRAILERS AND SEMI-TRAILERS		
35	OTHER TRANSPORT EQUIPMENT		
36	MANUFACTURING NEC		
37	RECYCLING		

Table A2: Computation of initial capital stock for each sector:
Average over time and countries (Belgium, Canada, Finland, France and Italy) of

$$p_k \cdot \text{CAPK} / \text{VALU}$$

sector	<i>c</i>
15-16	2.75
17-19	2.07
20	3.91
21-22	2.89
23-25	3.31
26	3.15
27-28	3.14
29	1.52
30-33	1.52
34-35	2.39
36-37	2.55