

Estimating Production Uncertainty in the European Beer Industry using a Statistical Model

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ABSTRACT. *The uncertainty in the results of the investment evaluation creates conditions of risk in decision-making in the management of industrial units. The article estimates the uncertainty of production in the European Brewery industry using a statistical model.*

KEY WORDS: *investment, beverage industry, risk, uncertainty, investment evaluation, statistical methods*

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I. INTRODUCTION AND LITERATURE REVIEW

The purpose of this work is to highlight and evaluate - through a mathematical model - the effect of factors such as the production of the product, the per capita demand of the product, the revenue from direct consumption taxation, the number of industrial units of the product produced, the number of directly employed in the industrial sector in the uncertainty of the production of products in the industrial sector of beverages and in particular of brewing.

II. LITERATURE REVIEW

At the level of manufacturing firms, Price (1995) surveys some firms in the British manufacturing industry and examines the relationship between uncertainty, capacity, and investment. The uncertainty is measured by the variation of the GDP using a GARCH model, controlling for the effect of cumulative uncertainty on investments. Also, Price (1996), examining the same industry, investigates the long-run relationship between uncertainty and investment. Uncertainty is measured as the conditional variance of manufacturing output using a GARCH (1,1) model. The conclusions reached by Price in both studies show the negative effect of uncertainty on investments. Using an innovative measure of firm-level cash flow uncertainty, Bhagat and Obreja (2013) empirically show that uncertainty has a strong negative impact on firm employment and investment in both tangible and intangible assets. Toro-Gonzalez et al (2014) use models to estimate fluctuations in beer consumption, such as the Almost Ideal Demand System. Esposti et al (2017) examine the effect of local factors on industry activity with a sample of 866 firms. Liu et al (2017) present an improved quantitative risk assessment model to help risk managers identify direct relationships between specific risk events and investor decision variables.

III. RESEARCH METHODOLOGY

The main factors that influence a company's decision to make or not an investment is the following: the expected demand and price of the product to be produced, the amount of wages and raw materials that will shape the cost of producing the product, the change of production technology, the tax policy for profits (Lianos & Benos, 2013, Mankiw, 2002). The determination of the relationship of production with uncertainty is approached by a Multiple Linear Regression model with the method of least squares. The model is described by the relation:

$$UNCERTAINTY_i = b_0 + b_1 * PRODUCT_i + b_2 * CONSUM_PER_CAPITA_i + b_3 * NUM_BREWERIES_i + b_4 * DIRECT_EMPLOYMENT_i + b_5 * EXCISE_DUTY_REVENUES_i + \varepsilon_i \quad i = 1, \dots, 31 \quad (1)$$

where:

UNCERTAINTY: Uncertainty, expressed as the standard deviation of the mean annual production quantity of the product (in HL) over the period 2015-21 for each country

PRODUCT: Average annual production quantity of the product (in HL) in the period 2015-21 for each country

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| | |
|-----------------------|--|
| CONSUM_PER_CAPITA: | Average per capita consumption of the product (in lt) in the period 2015-21 for each country |
| NUM_BREWERIES: | Average number of industrial beer units in the period 2015-21 for each country |
| DIRECT_EMPLOYMENT: | Average number of people directly employed in the product's industrial sector in the period 2015-21 for each country |
| EXCISE_DUTY_REVENUES: | Average revenue from direct taxation (in €1,000,000) of the industrial sector in the period 2015-21 for each country |
| ε_i : | Residuals, a random variable that includes all the remaining factors that cannot be considered in the model |

DATA ANALYSIS

Table 1: Linear Multiple Regression Data (UNCERTAINTY, PRODUCT, CONSUM_PER_CAPITA, NUM_BREWERIES, DIRECT_EMPLOYMENT, EXCISE_DUTY_REVENUES) 2015-2021

| COUNTRY | UNCERTAINTY | PRODUCT (HL) | CONSUM_PER_CAPITA (lt) | NUM_BREWERIES | DIRECT_EMPLOYMENT | EXCISE_DUTY_REVENUES (million €) |
|----------------|-------------|--------------|------------------------|---------------|-------------------|----------------------------------|
| AUSTRIA | 163 | 9296 | 105 | 281 | 3775 | 191,16 |
| BELGIUM | 403 | 20214 | 70 | 302 | 5841 | 192 |
| BULGARIA | 246 | 4876 | 75 | 29 | 2207 | 93,19 |
| CROATIAN | 465 | 3067 | 80 | 58 | 1566 | 83,64 |
| CYPRUS | 33 | 359 | 54 | 4 | 601 | 15,13 |
| CZECH REPUBLIC | 733 | 20412 | 139 | 506 | 5775 | 176,33 |
| DENMARK | 136 | 6035 | 62 | 206 | 4229 | 100,49 |
| ESTONIA | 50 | 1346 | 81 | 38 | 900 | 57,58 |
| FINLAND | 136 | 3901 | 74 | 98 | 1686 | 631 |
| FRANCE | 687 | 21379 | 33 | 1606 | 6726 | 906,52 |
| GERMANY | 3622 | 91604 | 97 | 1492 | 27362 | 634,4 |
| GREECE | 211 | 3836 | 34 | 50 | 2043 | 167,93 |
| HUNGARY | 283 | 5976 | 67 | 67 | 1922 | 118,87 |
| IRELAND | 1458 | 7278 | 75 | 71 | 1215 | 403,47 |
| ITALY | 1184 | 15959 | 33 | 805 | 5410 | 676,71 |
| LATVIA | 43 | 786 | 78 | 47 | 1400 | 42,48 |
| LITHUANIA | 189 | 3060 | 90 | 74 | 2300 | 82,41 |
| LUXEMBOURG | 36 | 268 | 66 | 24 | 119 | 5,14 |
| MALTA | 18 | 165 | 49 | 2 | 500 | 3,56 |
| NETHERLANDS | 1062 | 23736 | 67 | 676 | 5310 | 426,74 |
| POLAND | 1103 | 40268 | 97 | 263 | 9614 | 797,95 |
| PORTUGAL | 229 | 6728 | 49 | 107 | 2240 | 81,87 |
| ROMANIA | 342 | 16300 | 84 | 63 | 5847 | 138,43 |
| SLOVAKIA | 113 | 3036 | 70 | 74 | 1475 | 57,6 |
| SLOVENIA | 253 | 1905 | 78 | 84 | 709 | 86,81 |
| SPAIN | 1657 | 37011 | 49 | 399 | 8383 | 338,15 |
| SWEDEN | 176 | 4389 | 54 | 332 | 4719 | 426,58 |
| NORWAY | 110 | 2371 | 53 | 126 | 1275 | 612,96 |
| SWITZERLAND | 113 | 3492 | 54 | 984 | 2929 | 102,19 |
| TURKEY | 99 | 9671 | 12 | 14 | 2340 | 13,9 |
| UNITED KINGDOM | 2862 | 38654 | 68 | 1864 | 15917 | 4056,16 |

IV. RESULTS

Based on the available data for the period 2015 - 2021, the application of OLS to the model shows a good fit (F-test value = 38.563, p-value < 0.000) and explains 86.2 % (R²adj = 0.862) of variability of UNCERTAINTY (Table 2)

Table 2: Table of statistic R² and degrees of freedom

| Model | R | R Square | Adjusted R Square | R Square | F | df1 | df2 | Sig. F |
|-------|------|----------|-------------------|----------|--------|-----|-----|--------|
| | | | | | | | | |
| 1 | ,941 | ,885 | ,862 | ,885 | 38,563 | 5 | 25 | ,000 |

All TOL index are less than 0.500 which means a relatively high correlation of each explanatory variable with all the others, except for the CONSUM_PER_CAPITA variable with TOL = 0.855. (Table 3). Also, the Φ_j Condition Index < 10 for most variables and Φ_j Condition Index < 18 for another one, therefore there is a limited problem of multicollinearity, which can be considered as not creating a problem of reliability of the results.

Table 3: Degree of independence between explanatory variables

| Dimension | Eigenvalue | Condition Index Φ_i | | Tolerance (TOL) | VIF |
|-----------|------------|--------------------------|----------------------|-----------------|--------|
| 1 | 4,731 | 1,000 | | | |
| 2 | ,910 | 2,192 | PRODUCT | ,050 | 19,812 |
| 3 | ,494 | 2,976 | CONSUM_PER_CAPITA | ,855 | 1,169 |
| 4 | ,160 | 5,236 | NUM_BREWERIES | ,278 | 3,596 |
| 5 | ,050 | 9,334 | DIRECT_EMPLOYMENT | ,039 | 25,457 |
| 6 | ,014 | 17,728 | EXCISE_DUTY_REVENUES | ,441 | 2,279 |

Before presenting the model results, it is worth mentioning that the necessary homoskedasticity check was performed. The errors are distributed in such a way that the specific assumption is not violated, and they follow the normal distribution (Diagram 1) The variance of the residuals is constant, for small and for large values of the dependent variable UNCERTAINTY (Diagram 2), ensuring that the coefficients of the model are truly unbiased.

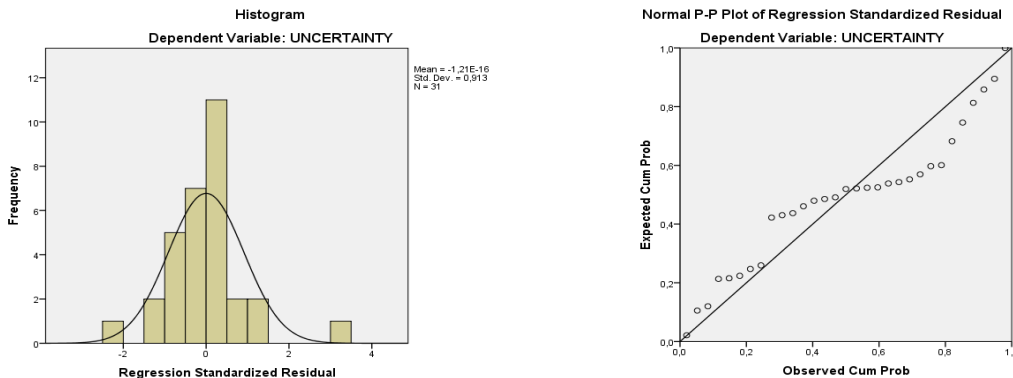


Diagram 1: Normal distribution of residuals

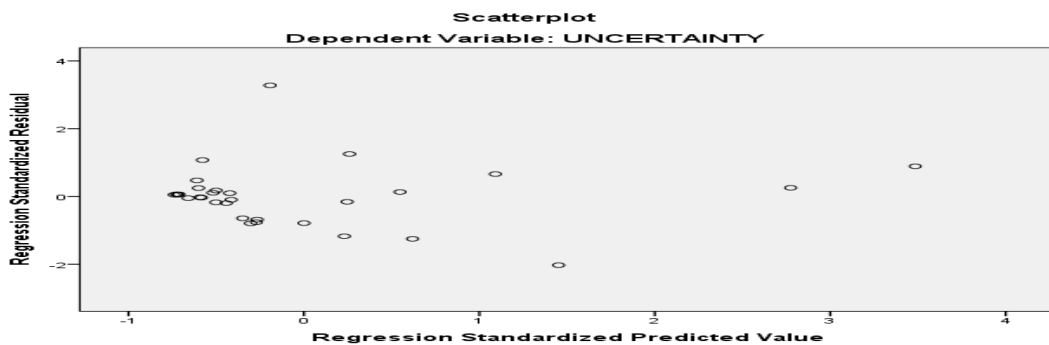


Diagram 2: Standardized residuals versus estimated values of the dependent variable

As can be seen from table 4, the factors PRODUCT and EXCISE_DUTY_REVENUES are statistically significant in terms of the interpretation of uncertainty (UNCERTAINTY) with p-value<0.05 while the factors CONSUM_PER_CAPITA, NUM_BREWERIES and DIRECT_EMPLOYMENT with p-value>0.05 do not influence the uncertainty (UNCERTAINTY). Ceteris paribus, an increase in the product produced (PRODUCT) and an increase in consumption tax revenues (EXCISE_DUTY_REVENUES) lead to an increase in uncertainty (UNCERTAINTY).

Table 4: Estimated coefficients of the model

| | B | t | Sig | TOL | VIF |
|----------------------|-------|-------|------|------|--------|
| (Constant) | 1,890 | ,011 | ,992 | | |
| PRODUCT | ,041 | 3,010 | ,006 | ,050 | 19,812 |
| CONSUM_PER_CAPITA | ,109 | ,043 | ,966 | ,855 | 1,169 |
| NUM_BREWERIES | ,007 | ,033 | ,974 | ,278 | 3,596 |
| DIRECT_EMPLOYMENT | -,025 | -,471 | ,641 | ,039 | 25,457 |
| EXCISE_DUTY_REVENUES | ,387 | 3,295 | ,003 | ,441 | 2,279 |

Therefore, the model that describes the uncertainty is as follows:

$$UNCERTAINTY_i = 1,890 + 0,041 * PRODUCT_i + 0,109 * CONSUM_PER_CAPITA_i + 0,007 * NUM_BREWERIES_i - 0,025 * DIRECT_EMPLOYMENT_i + 0,387 * EXCISE_DUTY_REVENUES_i + \epsilon_i \quad i = 1, \dots, 31$$

By removing the non-statistically significant variables, the model takes the following form:

$$UNCERTAINTY_i = 0,041 * PRODUCT_i + 0,387 * EXCISE_DUTY_REVENUES_i + \epsilon_i \quad i = 1, \dots, 31$$

V. CONCLUSIONS

Based on the above results for the interpretation of the model apply: An increase of 1 unit in the variable PRODUCT (production) leads to an increase in the variable UNCERTAINTY (uncertainty) by 0.041 units. Changes in the CONSUM_PER_CAPITA (per capita consumption), NUM_BREWERIES (number of industrial units) and DIRECT_EMPLOYMENT (direct employment) variables do not affect the UNCERTAINTY variable, as they are not statistically significant. An increase of 1 unit in the variable EXCISE_DUTY_REVENUES (consumption tax revenue), leads to an increase in UNCERTAINTY, which expresses Investments by 0.387 units. In conclusion, increasing trends in the factors of industrial beer production and consumption tax revenues lead to a small increase in uncertainty. The factors of directly employed in the industry, the number of industrial units and per capita consumption do not affect the uncertainty of production.

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