

**РОЗДІЛ V**  
**Підприємництво, торгівля та**  
**біржова діяльність**

UDC 339.37:519.876

**Bilovodska Olena,**  
**Dr. in Economics, Professor,**  
**Taras Shevchenko National University of Kyiv,**  
**Department of Marketing and Business-Administration, Kyiv, Ukraine,**  
**ORCID ID 0000-0003-3707-0734**  
**e-mail: o.bilovodska@knu.ua**

**Ivanchenko Kostiantyn,**  
**Ph.D student,**  
**Taras Shevchenko National University of Kyiv,**  
**Department of International Economics, Kyiv, Ukraine,**  
**ORCID ID: 0000-0003-1420-1914**  
**e-mail: ivanchenko.kostiantyn@gmail.com**

<https://doi.org/10.29038/2786-4618-2024-01-124-134>

**MODELLING THE RELATIONSHIP BETWEEN RETAIL DEVELOPMENT AND  
ECONOMIC INDICATORS IN EUROPEAN COUNTRIES**

**Abstract.** The modern global market requires extraordinary attention to the development of retail trade, which is not only the face of the economy of countries, but also plays a key role in promoting their economic prosperity. In this context, understanding the relationship between retail development indicators and indicators of the state of the economy is necessary given the importance of retail trade as one of the key elements of economic systems and is an important task for scientists and economists. Highlighting the relationship between retail trade and the state of the economy of European countries opens up opportunities for understanding and predicting economic and social trends on the path of Ukraine's accession to the EU, and promotes entrepreneurship. This study aims to model the relationship and establish statistically significant dependencies between the development of retail trade and the economic development of European countries, and to identify indicators that have an impact on the development of the industry. The study established a statistically significant impact of economic growth characteristics on the development of the retail trade industry in European countries in 2005-2022. In particular, it has been determined that the volume of trade turnover depends on such indicators as GDP per capita, consumer inflation and unemployment in the economy. The number of retailers is influenced by the volume of high-tech exports and the Gini index, which measures income inequality in the country. The number of employees in the industry depends on consumer inflation, unemployment and the Gini index. The share of income that is invested in the operating activities of the industry's enterprises depends on the level of consumer inflation, unemployment, the share of research and development expenditures in GDP and GDP per capita. GDP per capita has the strongest positive effect on turnover and consumer inflation on turnover. The unemployment rate has the strongest negative impact on turnover and the number of employees in the industry. The study confirmed the hypothesis about the positive impact of economic development on the retail industry in European countries. An economic system that promotes investment in research and development, aims to reduce unemployment and increase economic efficiency, plays a key role in the development of the retail industry in European countries. Given this, future research should focus on other factors that may influence the development of the retail industry in order to better understand the processes taking place in this area and to develop more accurate and effective strategies to promote its sustainable growth.

**Keywords:** retail trade, economic development, international relations, market analysis, modelling.

Біловодська Олена,  
доктор економічних наук, професор,  
Київський національний університет імені Тараса Шевченка,  
кафедра маркетингу і бізнес-адміністрування,  
Київ, Україна  
Іванченко Костянтин,  
здобувач ступеня вищої освіти доктора філософії,  
Київський національний університет імені Тараса Шевченка,  
кафедра міжнародної економіки,  
м. Київ, Україна

## МОДЕЛЮВАННЯ ВЗАЄМОЗВ'ЯЗКУ МІЖ РОЗВИТКОМ РОЗДРІБНОЇ ТОРГІВЛІ ТА ЕКОНОМІЧНИМИ ПОКАЗНИКАМИ В ЄВРОПЕЙСЬКИХ КРАЇНАХ

**Анотація.** Сучасний глобальний ринок вимагає надзвичайної уваги до розвитку роздрібною торгівлі, яка є не лише обличчям економіки країн, а й відіграє ключову роль у забезпеченні їх економічного процвітання. У цьому контексті розуміння взаємозв'язку між показниками розвитку роздрібною торгівлі та індикаторами стану економіки є необхідним з огляду на важливість роздрібною торгівлі як одного з ключових елементів економічних систем і є важливим завданням для науковців та економістів. Висвітлення взаємозв'язку між роздрібною торгівлею та станом економіки європейських країн відкриває можливості для розуміння та прогнозування економічних та соціальних тенденцій на шляху вступу України до ЄС, а також сприяє розвитку підприємництва. Метою даного дослідження є моделювання взаємозв'язку та встановлення статистично значущих залежностей між розвитком роздрібною торгівлі та економічним розвитком європейських країн, а також виявлення показників, які мають вплив на розвиток галузі. В статті встановлено статистично значущий вплив характеристик економічного зростання на розвиток галузі роздрібною торгівлі в європейських країнах у 2005-2022 роках. Зокрема, визначено, що обсяг товарообороту залежить від таких показників, як ВВП на душу населення, споживча інфляція та рівень безробіття в економіці. На кількість підприємств роздрібною торгівлі впливає обсяг високотехнологічного експорту та індекс Джині, який вимірює нерівність доходів у країні. Кількість працівників у галузі залежить від споживчої інфляції, рівня безробіття та індексу Джині. Частка доходу, яка інвестується в операційну діяльність підприємств галузі, залежить від рівня споживчої інфляції, безробіття, частки витрат на дослідження та розробки у ВВП та ВВП на душу населення. ВВП на душу населення має найсильніший позитивний вплив на товарооборот, а споживча інфляція - на товарооборот. Рівень безробіття має найсильніший негативний вплив на товарообіг та кількість працівників у галузі. Дослідження підтвердило гіпотезу про позитивний вплив економічного розвитку на роздрібною торгівлю в європейських країнах. Економічна система, яка сприяє інвестиціям у дослідження та розробки, спрямована на зниження рівня безробіття та підвищення економічної ефективності, відіграє ключову роль у розвитку галузі роздрібною торгівлі в європейських країнах. З огляду на це, майбутні дослідження мають бути зосереджені на інших факторах, які можуть впливати на розвиток галузі роздрібною торгівлі, з метою кращого розуміння процесів, що відбуваються в цій сфері, та розробки більш точних і ефективних стратегій сприяння її сталому зростанню.

**Ключові слова:** роздрібною торгівля, економічний розвиток, міжнародні зв'язки, аналіз ринку, моделювання.

**Problem statement and its significance.** Ukraine is currently engaged in a devastating war that has severely damaged its economy and infrastructure. As the country looks to rebuild and recover, identifying new sources of economic growth and global competitiveness will be critical. Retail trade represents a major component of Ukraine's GDP, accounting for over 10% of total economic output. With the right policies and strategies, the continued development of Ukraine's retail sector could provide an important boost to the economy during this difficult period. Specifically, retail growth and modernization would create new jobs, increase worker productivity, bring in tax revenues for the government, attract foreign investment, and promote innovation and entrepreneurship. A stronger retail industry could also enable Ukraine to better integrate with the economies of Europe as it pursues membership in the European Union. However, realizing these benefits will require a detailed understanding of the key factors and indicators influencing the performance of Ukraine's retail trade. The development of an innovative, thriving retail industry would not only benefit Ukraine economically, but could also signal that the country remains open for business on the

global stage even amidst the devastating war.

**Analysis of recent research and publications.** This topic has been the subject of many works by both Ukrainian and international scientists. Thus, the current state of trade and key indicators were studied: the number of business entities in the market, regional and commodity structure of retail turnover [1], global trends in the development of e-commerce and key differences between modern e-commerce and the traditional concept of retail trade [2], the state of trade enterprises in the context of aggravating socio-political challenges, in particular, the COVID-19 pandemic and the full-scale war of the Russian Federation against Ukraine [3]. A clustering of European countries was developed according to factors such as: educational factors, income characteristics and indicators of income inequality (Gini coefficients), urbanisation factors, indicators reflecting the functioning of the healthcare system, quality of life factors and the impact of the (negative) environment [4]. Researchers have also modelled financial markets using mixed-effects models [5], and studied and modelled the Slovak retail market [6].

In the context of using panel data, the relationship between stock market development and environmental quality has been studied [7], the impact of product and labour market legislation on unemployment [8], the impact of logistics efficiency on energy and environmental economic indicators in Europe [9], and the relationship between indicators of economic transformation and insurance density and penetration [10].

Based on the construction of mathematical models, researchers have investigated the relationship between industry sales and disposable personal income and consumer sentiment, and found a significant negative relationship between industry sales and consumer debt burden [11]. It has also been determined that the transition to efficient electronic retail payments stimulates overall economic growth, consumption and trade [12]; the efficiency of the retail system changes at different rates in different countries and this can be explained by the country's population density, average store size within the country, the ratio of foreign trade, concentration, economic freedom and the percentage of urban population [13]. In addition, the impact of foreign direct investment in the retail sector has been studied [14].

Thus, the issue of studying the indicators of influence on retail trade is relevant, and this article is a natural continuation in this direction, and the dependence of retail trade development on the state of the economy in terms of individual indicators is not sufficiently studied.

**Purpose and tasks of the article.** The purpose of this study is to model the relationship and establish statistically significant dependencies between the development of retail trade and the economic development of European countries, and to identify indicators that have an impact on the development of the industry. The objectives of the study are as follows:

1) building a linear least-squares model, a model with fixed and random effects and selecting the best one to establish the relationship between the retail industry and the economic development of European countries

2) determining the impact of economic development indicators on the retail trade industry in European countries based on the assessment of statistical significance of the obtained results.

The hypothesis for the study is that the economic development of European countries has a positive impact on the development of the retail industry.

This influence can be manifested through:

1. Growth of household incomes. The economic development of European countries is leading to an increase in household incomes, which encourages people to spend more money on goods and services. Retail trade is the main mechanism that satisfies consumer demand. Increased demand fuels the development of retail trade, as retailers need more sales to meet demand.

2. Increased investment. The economic development of European countries attracts investments that contribute to the development of retail trade. Foreign investors, wishing to benefit from the growing consumer market, invest in retail by creating new stores, shopping centres and developing existing businesses. This leads to increased competition and a wider range of goods and services in the retail sector.

3. Growth of tourist flow. Economically developed countries in Europe are often popular tourist destinations. The increase in tourist flow brings significant profits to retailers. Tourists spend money on gifts, souvenirs, clothing, food, and other goods and services during their trips. This contributes to the growth of

retail sales and the development of the industry.

4. Attracting innovations. The economic development of European countries is usually accompanied by the introduction of new technologies and innovations. This has an impact on the retail sector, as businesses become more efficient, introduce new management methods, improve their supply chain, and offer new products and services. Innovations help to attract customers, increase competitiveness and grow retailers.

5. Employment growth. Retail development depends on the availability of consumers and labour. Economic growth in Europe is driving employment growth as higher incomes and higher living standards encourage retailers to increase staff, hire new employees and create new jobs.

**Results.** The study was conducted on the basis of collected and processed aggregate statistical data for 2005-2022 on the retail industry and the economic situation in European countries (Austria, Belgium, Bulgaria, Croatia, Cyprus, Czech Republic, Denmark, Estonia, Finland, France, Germany, Greece, Hungary, Ireland, Italy, Latvia, Lithuania, Luxembourg, Malta, the Netherlands, Norway, Poland, Portugal, Romania, Slovakia, Slovenia, Spain, Sweden, Switzerland, the United Kingdom) from the European Commission databases [16] and World Development Indicators [17] and divided into several stages:

1. Collection and analysis of aggregated statistical data on the development of the retail industry and economic indicators of European countries.

2. Identification of indicators that will be used to measure the development of the retail sector and the economic development of countries. The indicators are divided into two groups: indicators related to retail trade and indicators reflecting economic development.

3. Reconnaissance data analysis to determine the structure, format, distribution, anomalies and features of the data, and to process and clean it before modelling.

4. Building OLS, Country-Specific Fixed Effects and Random models for each dependent variable and selecting the model that best describes the relationship between the retail industry and economic development of European countries.

5. Identification of the impact of economic development indicators on the retail trade industry in European countries based on the assessment of statistical significance of the results obtained.

Eurostat is the official statistical body of the European Union, which provides statistical data on the state of the European economy. From the databases of this organisation [16], 11 indicators on the development of retail trade in Europe were selected (Table 1).

Table 1

**Variables reflecting the state of retail trade in Europe**

| Variable code | Variable name   |
|---------------|---|
| IDT           | Index of deflated turnover  |
| HOWK          | Volume of work done (hours worked)                                    |
| WAGE          | Gross wages and salaries  |
| ENO           | Enterprises – number  |
| PRV           | Production value – million euro                                       |
| VAF           | Value added at factor cost – million euro                             |
| TPGS          | Total purchases of goods and services – million euro                  |
| CSGS          | Change in stocks of goods and services – million euro                 |
| PC            | Personnel costs – million euro  |
| PEN           | Employment (number of persons employed)                               |
| IR            | Investment rate (investment/value added at factors cost) – percentage |

Source: compiled by the authors.

The World Bank is an international financial organization that provides data and analytical information on the economic development of countries around the world. From the database of this organization [17], 15 macroeconomic indicators of European countries were selected (Table 2).

Table 2

## Variables reflecting the state of the economy in European countries

| Variable code | Variable name                        |
|---------------|--------------------------------------|
| GDPPC         | GDP per capita                       |
| FDI           | Foreign direct investment            |
| HCI           | Human capital index (HCI)            |
| LIFE          | Life expectancy at birth             |
| CPI           | Consumer price index                 |
| INF           | Inflation, consumer prices           |
| UNEMP         | Unemployment                         |
| EXP           | Exports of goods and services        |
| HTEXP         | High-technology exports              |
| SEXP          | Service exports                      |
| SIMP          | Service imports                      |
| IMP           | Imports of goods and services        |
| GINI          | Gini index                           |
| RDE           | Research and development expenditure |
| EXTT          | External trade of goods and services |

Source: compiled by the authors.

The problem of the obtained dataset is the presence of missing data, so the authors removed the data on Human Capital Index, foreign direct investment and inflation for all countries, as well as data on countries such as Bosnia and Herzegovina, Montenegro, North Macedonia, Albania, Serbia, Turkey and Iceland, as they contained little information, and reduced the number of missing data to 10.3% and considered updated information on the missing data using the `visdat` library of the R programming language. Missing data were imputed using the "pmm" method, i.e. predictive mean matching, a popular imputation method.

With the complete data set, we conducted an exploratory data analysis, the results of which are presented in Fig. 1.

```

CountryN      CountryN      Year      IDT      HOWK
Length:540    Min. : 1.0    Min. :2005  Min. : 22.40  Min. : 49.90
Class :character  1st Qu.: 8.0    1st Qu.:2009  1st Qu.: 94.35  1st Qu.: 98.28
Mode :character  Mean :15.5    Mean :2014    Mean :101.15  Mean :100.66
                3rd Qu.:23.0  3rd Qu.:2018  3rd Qu.:109.60  3rd Qu.:103.72
                Max. :30.0    Max. :2022    Max. :171.00   Max. :142.60

WAGE      ENO      PRV      VAF      TPGS
Min. : 45.2  Min. : 2974  Min. : 398.6  Min. : 232.5  Min. : 1494
1st Qu.: 93.9  1st Qu.: 19587  1st Qu.: 4500.0  1st Qu.: 2095.1  1st Qu.: 13610
Median :105.1  Median : 81039  Median : 14285.8  Median : 8019.6  Median : 40593
Mean :105.8  Mean :123470  Mean : 30179.2  Mean :16909.2  Mean : 78965
3rd Qu.:111.0  3rd Qu.:128811  3rd Qu.: 30179.2  3rd Qu.:16909.2  3rd Qu.: 78965
Max. :313.6  Max. :698731  Max. :236852.9  Max. :132642.9  Max. :551076

CSGS      PC      PEN      IR      GDPPC
Min. : -2753.1  Min. : 119.2  Min. : 75.5  Min. : 4.70  Min. : 3900
1st Qu.: 70.5  1st Qu.: 1259.2  1st Qu.: 97.2  1st Qu.:11.18  1st Qu.:18095
Median : 258.5  Median : 5522.9  Median :100.0  Median :16.39  Median :36195
Mean : 258.5  Mean :11075.7  Mean :100.5  Mean :16.39  Mean :37613
3rd Qu.: 258.5  3rd Qu.:11075.7  3rd Qu.:103.5  3rd Qu.:16.82  3rd Qu.:49916
Max. : 5847.1  Max. :87087.7  Max. :134.0  Max. :76.70  Max. :133590

LIFE      CPI      UNEMP      EXP      HTEXP
Min. :70.87  Min. : 72.14  Min. : 2.010  Min. :6.637e+09  Min. :5.477e+07
1st Qu.:77.16  1st Qu.: 98.61  1st Qu.: 5.058  1st Qu.:4.539e+10  1st Qu.:2.095e+09
Median :80.10  Median :105.82  Median : 6.955  Median :1.502e+11  Median :1.682e+10
Mean :79.16  Mean :105.53  Mean : 7.913  Mean :2.661e+11  Mean :2.501e+10
3rd Qu.:81.40  3rd Qu.:111.04  3rd Qu.: 9.125  3rd Qu.:3.355e+11  3rd Qu.:2.501e+10
Max. :83.90  Max. :151.94  Max. :27.470  Max. :2.003e+12  Max. :2.156e+11

SEXP      SIMP      IMP      GINI      RDE
Min. :2.467e+09  Min. :1.602e+09  Min. :7.306e+09  Min. :23.20  Min. :0.371
1st Qu.:1.224e+10  1st Qu.:8.760e+09  1st Qu.:4.679e+10  1st Qu.:28.80  1st Qu.:1.281
Median :3.965e+10  Median :3.178e+10  Median :1.330e+11  Median :31.33  Median :1.506
Mean :7.638e+10  Mean :6.651e+10  Mean :2.502e+11  Mean :31.33  Mean :1.506
3rd Qu.:1.042e+11  3rd Qu.:8.918e+10  3rd Qu.:3.183e+11  3rd Qu.:33.73  3rd Qu.:1.506
Max. :4.931e+11  Max. :4.597e+11  Max. :1.777e+12  Max. :41.30  Max. :3.749

EXTT
Min. :1.394e+10
1st Qu.:9.142e+10
Median :2.880e+11
Mean :5.163e+11
3rd Qu.:6.564e+11
Max. :3.780e+12

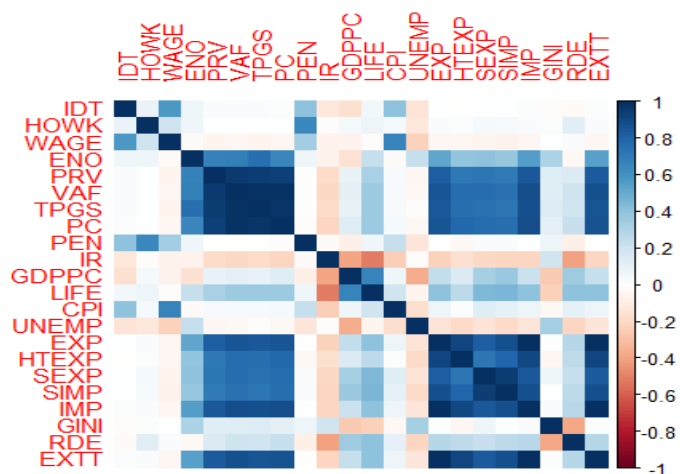
```

**Fig. 1.** Results of intelligence analysis of data

Source: compiled by the authors using the R programming language.

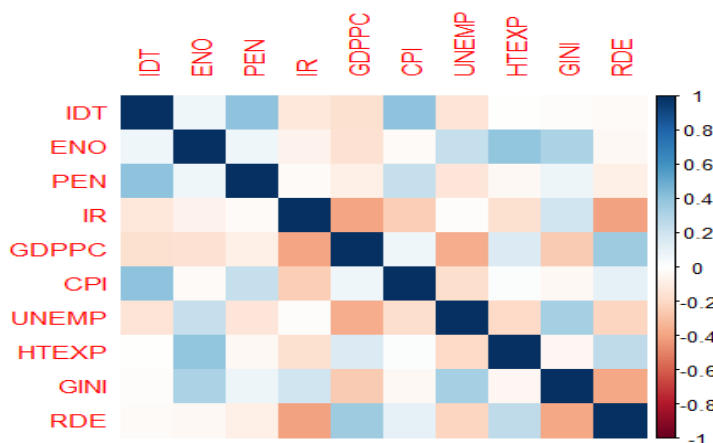
After that, the `CSGS` variable was removed because it has negative values, which can affect the

efficiency of modelling, and the variables were analysed for multicollinearity. It was found that there is a significant correlation between individual variables, and the correlation matrix (Fig. 2) is presented:



**Fig. 2.** Correlation matrix of the data set  
 Source: compiled by the authors using the R programming language

Since there is multicollinearity in the data block related to foreign trade, one indicator, exports of goods and services, was retained. It was found that the data from the retail trade block are highly correlated, so the variables PRV, VAF, TPGS, PC were removed from the model and re-estimated, thus improving the data set. It was also found that there are variables with less interdependence that can also distort the results of the study, and therefore WAGE, HOWK and LIFE were removed and the data were re-estimated (Fig. 3).



**Fig. 3.** The correlation matrix of the data set after removing the variables PRV, VAF, TPGS, PC, WAGE, HOWK and LIFE  
 Source: compiled by the authors using the R programming language

Thus, we removed all data that had medium and higher correlations with each other, normalised them, created OLS models, and re-checked the data for multicollinearity using VIF Values (Fig. 4).

|          |          |          |          |          |          |
|----------|----------|----------|----------|----------|----------|
| GDPPC    | CPI      | UNEMP    | HTEXP    | GINI     | RDE      |
| 1.280405 | 1.042465 | 1.321283 | 1.109131 | 1.294192 | 1.353345 |

**Fig. 4.** VIF values for the dependent variables

Source: compiled by the authors using the R programming language

Regarding the interpretation of VIF values, it was found that the data are suitable for building models and in order to substantiate the primary hypothesis of the existence of a relationship, 4 OLS models, 4 fixed and 4 random effects models (3 for each indicator of retail market development) were built.

First, we built models with the dependent variable IDT (basic OLS model (Fig. 5)).

```
Call:
lm(formula = IDT ~ GDPPC + CPI + UNEMP + HTEXP + GINI + RDE,
    data = final_normalized_data)

Residuals:
    Min       1Q   Median       3Q      Max
-4.9406 -0.3494 -0.0272  0.4293  3.8942

Coefficients:
(Intercept)  1.817e-17  3.799e-02  0.000  1.000000
GDPPC        -2.517e-01  4.303e-02 -5.850  8.58e-09 ***
CPI          3.981e-01  3.883e-02 10.253 < 2e-16 ***
UNEMP       -1.597e-01  4.371e-02 -3.653  0.000285 ***
HTEXP       -6.781e-04  4.005e-02 -0.017  0.986496
GINI        -2.536e-02  4.326e-02 -0.586  0.558015
RDE         -2.389e-02  4.424e-02 -0.540  0.589351
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.8829 on 533 degrees of freedom
Multiple R-squared:  0.2292, Adjusted R-squared:  0.2205
F-statistic: 26.42 on 6 and 533 DF, p-value: < 2.2e-16
```

**Fig. 5.** Characteristics of the OLS model with the dependent variable IDT

Source: compiled by the authors using the R programming language

Multiple R-squared: 0.2292 and adjusted R-squared: 0.2205 indicate a weak linear relationship in the model. GDPPC, CPI and UNEMP are also found to be significant variables.

Next, we created a Country-Specific Fixed Effects model using the plm package, which reflects a moderate dependence, with GDPPC, CPI, UNEMP as significant variables, and examined the impact of different countries on the model (Fig. 6).

|             |                |           |             |
|-------------|----------------|-----------|-------------|
| Austria     | Belgium        | Bulgaria  | Croatia     |
| -0.739823   | -0.385391      | 0.228158  | 1.093918    |
| Cyprus      | Czechia        | Denmark   | Estonia     |
| 0.741455    | -0.176523      | -0.452243 | 0.027749    |
| Finland     | France         | Germany   | Greece      |
| -0.209552   | 0.049829       | -0.071393 | 2.698329    |
| Hungary     | Ireland        | Italy     | Latvia      |
| 0.314611    | 0.126154       | 0.322625  | 0.624237    |
| Lithuania   | Luxembourg     | Malta     | Netherlands |
| 0.468071    | -3.711384      | -0.575092 | -0.364950   |
| Norway      | Poland         | Portugal  | Romania     |
| -1.690080   | 0.260542       | 0.802730  | 0.298160    |
| Slovakia    | Slovenia       | Spain     | Sweden      |
| 0.555317    | 0.460294       | 1.835684  | -0.636838   |
| Switzerland | United Kingdom |           |             |
| -1.246775   | -0.647817      |           |             |

**Fig. 6.** Fixed effects for different countries in the model

Source: compiled by the authors using the R programming language

The coefficients show how much the dependent variable changes on average over time in each country.

Next, the authors compare the OLS model and the fixed effects model using F-testing. If the p-value is less than 0.05, then the fixed effects model is the better choice. Therefore, the OLS model is rejected.

Next, we built a model with Random Effects (Fig. 7).

```
Oneway (individual) effect Random Effect Model
(Swamy-Arora's transformation)

Call:
plm(formula = IDT ~ GDPPC + CPI + UNEMP + EXP + GINI + RDE, data = final_norm
alized_data,
      model = "random")

Balanced Panel: n = 30, T = 18, N = 540

Effects:
              var std.dev share
idiosyncratic 0.4189  0.6472 0.786
individual    0.1139  0.3375 0.214
theta: 0.5881

Residuals:
      Min.      1st Qu.      Median      3rd Qu.      Max.
-3.953046 -0.300193 -0.041593  0.271665  3.642601

Coefficients:
              Estimate Std. Error z-value Pr(>|z|)
(Intercept)  1.9550e-16  7.4873e-02  0.0000  1.0000
GDPPC        -8.9840e-02  6.7960e-02 -1.3219  0.1862
CPI           4.0436e-01  3.2615e-02 12.3980 <2e-16 ***
UNEMP        -4.5541e-01  4.4930e-02 -10.1359 <2e-16 ***
EXP          -2.0407e-03  6.6265e-02 -0.0308  0.9754
GINI          1.3302e-02  5.5110e-02  0.2414  0.8093
RDE          -3.3474e-02  4.3458e-02 -0.7703  0.4412
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Total Sum of Squares: 435.37
Residual Sum of Squares: 273.73
R-Squared: 0.37126
Adj. R-Squared: 0.36419
Chisq: 314.732 on 6 DF, p-value: < 2.22e-16
```

**Fig. 7.** Characteristics of the Random Effects model with the dependent variable IDT

Source: compiled by the authors using the R programming language

Multiple R-squared: 0.37126 and adjusted R-squared: 0.36419 indicate a moderate linear relationship in the model, and the significant variables are CPI and UNEMP.

To determine the more appropriate model between fixed and random effects, a Hausman test is performed (Fig. 8), where the null hypothesis is that a random effects model is preferred over the alternative fixed effects model. This test tests whether the unique errors are correlated with the regressors; the null hypothesis is that they are not. If the p-value is significant (e.g., <0.05), then a fixed-effects model should be used, otherwise a random-effects model should be used.

#### Hausman Test

```
data: IDT ~ GDPPC + CPI + UNEMP + EXP + GINI + RDE
chisq = 54.547, df = 6, p-value = 5.721e-10
alternative hypothesis: one model is inconsistent
```

**Fig. 8.** Results of the Hausman test for random effects and fixed effects models

Source: compiled by the authors using the R programming language

Therefore, fixed-effects models were used for the IDT variable.

Similarly, models were developed for the dependent variable ENO.

Thus, after building the OLS model, it was found that with multiple R-squared of 0.3238 and adjusted R-squared of 0.3162, there is a weak linear relationship, and the significant variables are UNEMP, HTEXP and GINI. Next, a Country-Specific Fixed Effects model is created and a very weak linear relationship is



found in the model (Multiple R-squared 0.09 and Adjusted R-squared 0.02), and the significant variables are HTEXP and GINI. The impact of different countries on the model is also examined and strong heterogeneity of results is found. Next, the OLS model and the fixed effects model are compared, after which the OLS model is rejected as the p-value is less than 0.05 and the fixed effects model is a better choice. After developing the model with Random Effects, a very weak linear relationship is found in the model (multiple R-squared: 0.10017 and adjusted R-squared: 0.09), and the significant variables are HTEXP and GINI. Further, based on the results of the Hausman test, the authors chose the fixed model for the ENO variable, as it is the best model.

Next, we build models with the dependent variable PEN.

1) OLS (multiple R-squared: 0.09812 and adjusted R-squared: 0.08797, indicating a very weak linear relationship in the model), the significant variables are CPI and UNEMP;

2) Country-Specific Fixed Effects model, using plm package (weak dependence is established), significant variables are CPI, UNEMP, and the impact of individual countries on this dependence is considered (heterogeneity of data from different countries is revealed);

3) based on the comparison of the OLS model and the fixed effects model, the OLS model is rejected and the Random Effects model is built, which reflects a weak dependence, and the significant variables are CPI, UNEMP.

4) according to the results of the Hausman test for random effects and fixed effects models, the model with fixed variables is more significant.

We also built models for the IR variable and identified them:

1) a significant linear relationship in the OLS model (multiple R-squared 0.8119 and adjusted R-squared 0.3409) and the significant variables are GDPPC, CPI, UNEMP, RDE, HTEXP, GINI;

2) weak dependence when building a Country-Specific Fixed Effects model using the plm package, and the significant variables are CPI, UNEMP, RDE;

3) the need to reject the OLS model based on the results of F-testing with a fixed effects model and build a model with Random Effects, which reflects a weak dependence, the significant variables are CPI, UNEMP, RDE, GDPPC;

4) use of a random effects model based on the Hausman test for random effects and fixed effects models.

Thus, we can summarise the results of the developed models (Table 3).

To begin with, let us consider the difference between R-Squared and adj. R-Squared, which is that the R-Squared value assumes that all the independent variables considered affect the model outcome, while adj. R-Squared takes into account only those independent variables that actually affect the performance of the model.

Table 3

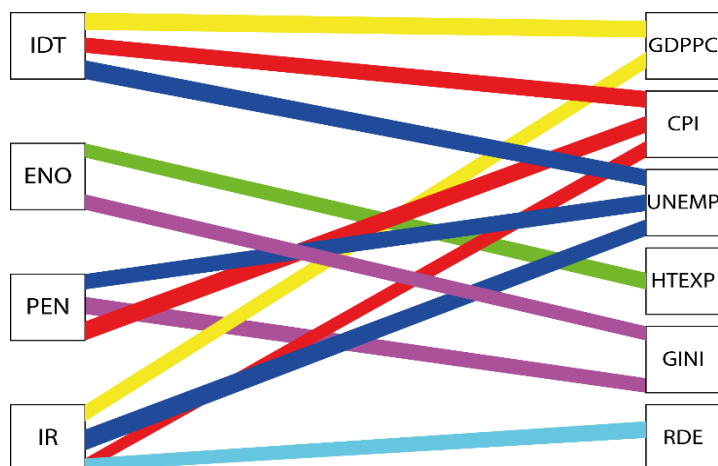
Results of modelling the 4 dependent variables

| № | Dependent variable | Model type | R-Squared | Adj. R-Squared | Level of interconnection  |
|---|--------------------|------------|-----------|----------------|---|
| 1 | IDT                | fixed      | 0.49024   | 0.45484        | The developed model explains 45% of the changes in the values of the independent variable, which is the average result.                     |
| 2 | ENO                | fixed      | 0.092401  | 0.029373       | The developed model explains changes in the independent variable by 3%, which is a very low result, and therefore this model is irrelevant. |
| 3 | PEN                | fixed      | 0.22641   | 0.17269        | This model explains 17% of the changes in the independent variable, which is a low result, and therefore this model is relevant but weak.   |
| 4 | IR                 | random     | 0.2452    | 0.2367         | This model explains 24% of the changes in the independent variable, which is a low result, and therefore this model is relevant but weak.   |

Source: compiled by the authors

Thus, it can be summarised that IDT (number of goods sold) is influenced by GDPPC (GDP per capita), CPI (consumer inflation), UNEMP (unemployment rate in the economy); ENO (number of retailers) is influenced by HTEXP (volume of high-tech exports) and GINI (Gini index, which characterises income inequality in the country); PEN (number of employees in the industry) is influenced by CPI, UNEMP, GINI; and IR (share of income invested in the activities of the industry) is influenced by CPI, UNEMP, RDE (share of R&D expenditure in GDP), GDPPC.

Let's display these dependencies graphically (Fig. 7).



**Fig. 7.** Influence of dependent variables on independent variables based on modelling results

Source: compiled by the authors.

Let's also consider the sensitivity of the industry's indicators to macroeconomic indicators. To do this, let's place the coefficients near the significant variables (Table 4).

Table 4

**Sensitivity of industry indicators to macroeconomic indicators based on modelling results**

|     | GDPPC    | CPI      | UNEMP     | HTEXP     | GINI      | RDE      |
|-----|----------|----------|-----------|-----------|-----------|----------|
| IDT | 0.438301 | 0.364879 | -0.562003 | –         | –         | –        |
| ENO | –        | –        | –         | 0.1613563 | 0.1716693 | –        |
| PEN | –        | 0.225607 | -0.47127  | –         | 0.177498  | –        |
| IR  | -0.22253 | -0.25521 | -0.17607  | –         | –         | -0.26561 |

Source: compiled by the authors.

So, let's sort these connections by strength (from the strongest to the weakest) and direction:

1. Directly related are: 1) GDP per capita and trade turnover; 2) CPI and trade turnover; 3) CPI and number of employees; 4) Gini index and number of employees; 5) Gini index and number of retailers.

2. The inverse relationship is: 1) unemployment rate and trade turnover, 2) unemployment rate and number of employees in the industry, 3) share of research and development expenditures in GDP and investment level, 4) CPI and investment level, 5) GDP per capita and investment level, 6) unemployment and investment level.

Thus, the study based on the panel data modelling method revealed a previously unexplored aspect of the relationship between the characteristics of the retail industry and the country's economy: a balanced economic system that supports R&D investments aimed at reducing unemployment and increasing the efficiency of the economy as a whole is an important component of retail development in European countries. In the future, further research should be aimed at identifying the links between other factors that may influence the development of the retail industry.

**References**

1. Soltis-Sholudko, N. (2023). Ukrainian retail market: main development trends. *Modern Engineering and*

- Innovative Technologies*, 4 (25-04), 74-78. Retrieved from <https://doi.org/10.30890/2567?5273.2023?25?04?071>
2. Zharnikova, V. V. (2019). Global trends and current realities of retail development in the digital economy. *Effective Economy*, 5. Retrieved from <http://www.economy.nayka.com.ua/?op=1&amp;z=7075>
  3. Deinega, I., Deinega, O., & Tsypiashchuk, K. (2023). Current trends in trade development in Ukraine. *Via Economica*, 2, 54-59. Retrieved from <https://doi.org/10.32782/2786-8559/2023-2-8>
  4. Nikolayeva, O. (2023). Cluster analysis of European countries by economic and non-economic factors of influence on health. *Grail of Science*, 26, 31-41. Retrieved from <https://doi.org/10.36074/grail?of?science.14.04.2023.001>
  5. Lyubkina, O., Kovtun, N., Knir, M. & Anisimova, L. (2021). Scenario modelling of the development of the advanced financial market. *Modern Problems of Business, Management and Economy*. Retrieved from <https://doi.org/10.3846/cibmee.2021.612>
  6. Mura, L., Marchevska, M. & Dubravska, M. (2018). A model of retail trade in Slovakia between panel regressions. *Marketing and Management of Innovations*, 4, 203-211. Retrieved from <https://doi.org/10.21272/mmi.2018.4-18>
  7. Musah, M. (2022). Stock market development and environmental quality in EU member countries: A dynamic heterogeneous approach. *Environment, Development and Sustainability*, 25, 11153-11187. Retrieved from <https://doi.org/10.1007/s10668-022-02521-1>
  8. Piton, C., & Rycx, F. (2018). The unemployment impact of product and labour market regulation: Evidence from European countries. *IZA Discussion Paper*, 11582. Retrieved from <https://doi.org/10.2139/ssrn.3205849>
  9. Zaman, K., & Shamsuddin, S. (2017). Green logistics and national scale economic indicators: Evidence from a panel of selected European countries. *Journal of Cleaner Production*, 143, 51-63. Retrieved from <https://doi.org/10.1016/j.jclepro.2016.12.150>
  10. Born, P., & Bujakowski, D. (2021). Economic transition and insurance market development: Evidence from post-communist European countries. *The Geneva Risk and Insurance Review*, 47, 201-237. Retrieved from <https://doi.org/10.1057/s10713-021-00066-3>
  11. Kaufinger, G.G., & Anderson (2014). Macroeconomic factors affecting US retail furniture/home furnishings industry sales. *Research in Business and Economics Journal*, 4, 1-10. Retrieved from <http://www.aabri.com/manuscripts/152203.pdf>
  12. Hasan, I., De Renzis, T., & Schmiedel, H. (2012). Retail payments and economic growth. *Bank of Finland Research Discussion Papers*. Retrieved from <https://publications.bof.fi/bitstream/handle/10024/47561/170343.pdf?sequence=1&isAllowed=y>
  13. Cruz Roche, I., Romero, J., & Sellers-Rubio, R. (2019). Retail services efficiency: The impact of country-specific factors. *International Journal of Retail & Distribution Management*, 47(8), 774-792. Retrieved from <https://doi.org/10.1108/ijrdm-12-2018-0275>
  14. Kambonde, A., & Rena, R. (2014). Foreign direct investment in the retail sector of Namibia: An analysis. *Journal of Economics*, 5(1), 27-35. Retrieved from <https://doi.org/10.1080/09765239.2014.11884981>
  15. Kulish, D. (2023). Modelling the impact of the external environment on the foreign economic activity of EU enterprises. *Modelling the development of the economic systems*, 2, 96-102. Retrieved from <https://doi.org/10.31891/mdes/2023?8?13>
  16. Eurostat. (2023). The European Commission. Retrieved from <https://ec.europa.eu/eurostat/web/main/data/database>.
  17. World development indicators (2023). Data bank | The World Bank. Retrieved from <https://databank.worldbank.org/source/world-development-indicators>.
  18. Bates, D. (2023). Lmer for SAS PROC MIXED Users. The Comprehensive R Archive Network. Retrieved from <https://cran.r-project.org/web/packages/SASmixed/vignettes/Usinglmer.pdf>.
  19. Fitting mixed-effects linear models with lme4. (2023). arXiv.org. Retrieved from <https://arxiv.org/abs/1406.5823>.
  20. Getting Started with Fixed/Random Effects Models with R. (2023). Retrieved from [https://rstudio-pubs-static.s3.amazonaws.com/372492\\_3e05f38dd3f248e89cdeedd317d603b9a.html](https://rstudio-pubs-static.s3.amazonaws.com/372492_3e05f38dd3f248e89cdeedd317d603b9a.html)