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DOES FOREIGN INVESTMENT IMPROVE TECHNICAL EFFICIENCY OF MANUFACTURING? EVIDENCE FROM THE REPUBLIC OF SERBIA

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Abstract: *This paper offers significant evidence for the presence of a beneficial impact of foreign direct investment on technical efficiency based on a balanced panel data on a sample of 92 manufacturing groups over the period 2010-2019. Throughout this period Serbia lost 28% of the potential output of the manufacturing sector due to technical inefficiency. The finding is directly supported by the results at the level of the observed groups. Thus, the greatest increase in technical efficiency is in branches with a high share of foreign ownership, such as: production of motor vehicles, production of chemicals, and production of wire and cable equipment. The methodology is based on stochastic frontier analysis - within that, 'true' random effects model. The paper contributes to a better understanding of the possible consequences of foreign-invested enterprises on the domestic economy and, in particular, the performance of local businesses. As a result, it is helpful to policymakers in developing counties, where FDI is thought to have technological spillovers on native businesses.*

Keywords: *Technical Efficiency, Foreign direct investment (FDI), Stochastic frontier model, Serbian manufacturing*

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Da li strane investicije popravljaju tehničku efikasnost prerađivačke industrije? Primer Republike Srbije

Apstrakt: Na osnovu balansiranih panel podataka 92 grane prerađivačke industrije u periodu 2010-2019 ovaj rad pronalazi jake dokaze o postojanju pozitivnog uticaja stranih direktnih investicija na tehničku efikasnost. Usled tehničke nefikasnosti prerađivački sektor Srbije je u posmatranom periodu izgubio 28% potencijalnog outputa. Nalaz potkrepljuju dokazi na nivou pojedinačnih grana. Tako, najveći porast tehničke efikasnosti je zabeležen u granama industrije sa visokim udelom stranog vlasništva, poput: proizvodnje motornih vozila, proizvodnje hemikalija i proizvodnje žičane i kablovske opreme. Primenjena metodologija istraživanja se bazira na analizi stohastičke granice, odnosno, modelu "istinski" stohastičkih efekata. Rad doprinosi razumevanju potencijalnih efekata poslovanja firmi u stranom vlasništvu kako na ukupnu domaću privredu tako i na performanse lokalnih kompanija. Sledstveno, nalazi su korisni kreatorima politika zemalja u razvoju, koje su stava da SDI pospešuje tehničku efikasnost domaće privrede.

Ključne reči: Tehnološka efikasnost, strane direktne investicije (SDI), model stohastičke granice, prerađivačka industrija Srbije

1. Introduction

"The contribution of foreign direct investment (FDI) to the developing economies has been examined by a large body of theoretical and empirical studies. The key objective of this paper was to match the quantification of technical inefficiency with the high inflow of FDI that has been characteristic of Serbia in recent years and determine how FDI affects a firm's technical efficiency (TE) improvement as well as its technical progress in a stochastic frontier (SF) model" (Nikolić, 2020a. p. 71).

We should note that Serbia, in spite of the COVID-19 crisis, recorded a relatively high FDI inflow of EUR 3.0 bn gross (6,4% of GDP) in 2020, too. FDI inflows, which were 13% higher than the five-year average and 41% higher than the ten-year average, remained broadly scattered and, as previously, mostly channeled to export-oriented industries, covering the current account deficit completely (NBS, 2021).

2. Literature review

In the literature, the relationship between FDI and productivity/efficiency has been hotly disputed. Many endogenous growth models supported the notion that FDI boosts TFP and so boosts economic growth. However, to the author's knowledge, there was just one paper that looked at the impact of FDI on the TE of the manufacturing sector in Serbia up until 2021 (Nikolić, 2020b). From that aspect this paper can certainly be considered original.

Since this paper studies TE and effects of FDI by applying SF model in the manufacturing industry it maybe useful to provide a brief review of the extant literature in the same context. Vu (2016), for example, used the SF model to calculate the TE of FDI firms in the Vietnamese manufacturing sector from 2009 to 2013. The average TE of FDI enterprises is around 60%, which is greater than the average TE of domestic firms (including private firms and state-owned firms). Wang and Wong (2012) used unbalanced panel data from a 77-country sample from 1986 to 2007 to show that FDI and imported foreign R&D have a considerable impact on the TE of domestic countries. Fedorova et al. (2019) on a sample of more than 33.000 Russian firms concluded that companies with FDI are characterized with a higher level of efficiency compared to companies without foreign capital.

Simultaneously, many studies empirically examines relationship between FDI spillovers and TE of domestic firms. According to Sur and Nandy (2018), FDI efficiency spillovers in the Indian automobile industry have a favorable impact on domestic business productivity from 2001 to 2014, and foreign firms are more technically efficient than domestic enterprises. Keshary (2013) on a sample of 177 firms for 7 years covering FY 2000/01 to FY 2006/07 found that the foreign affiliates of multinational enterprises as a ownership group maintains higher level of TE than domestic firms even after controlling for the additional determinants (both observed and unobserved) of TE. Likewise, the empirical results from the SF of Suyanto and Salim (2013) showed that foreign firms are more efficient than domestic competitors, and the presence of the former increases the inefficiency of the latter. These uthors received an even more detailed finding a year later. A panel data SF method is applied to 3318 Indonesian firms surveyed over the period 1988–2000. The findings show that FDI has a favorable impact on TE. When the samples are separated into two efficiency levels, however, interesting disparities appear. In general, negative spillovers are experienced by high-efficiency domestic enterprises, while positive spillovers are experienced by low-efficiency firms. These findings support the efficiency gap hypothesis, which states that the wider the gap between domestic and foreign enterprises, the easier it is for the former to derive spillover advantages from the latter (Suyanto et al, 2014).

Empirical studies have also yielded contradictory results regarding the spillover benefits from FDI. For example, Vu and Van Hang (2017) found positive vertical spill-over effects but no horizontal spill-over effects in firm-level panel data on the Vietnamese wearing apparel industry from 2009 to 2013. Furthermore, the absorptive capacity of domestic enterprises has a detrimental impact on the gains derived from FDI externalities, according to this study. Wang and Wong (2016) used data from more than 12,000 Chinese manufacturing firms (two-digit level industries in the manufacturing sector over 2002 to 2004) and discovered that FDI in a company's own industry (horizontal FDI) did not always boost its TE. However, firms with a larger absorptive capacity tend to benefit more from horizontal FDI than others. They also found that foreign presence in a firm's downstream industries helps improve the firm's TE, while foreign presence in upstream industries does not. The results of Wiboonchutikula et al. (2016) provide no evidence on spillover effects of the FDI in horizontal industries on either the TFP or TE of domestic firms. While FDI in upstream sectors has negative spillover effects on firms in all industry groups, FDI in downstream industries has positive and large spillover effects.

Following Jiang (2012) in China from 1981 to 2004 the FDI technical efficiency exhibits a U-shaped time pattern, i.e., there is efficiency deterioration in the early stage of China's reform and a gradual efficiency improvement after the mid-1990s. The results from the Phan and Ngo (2012) estimations reveal that, foreign firms, in general, are not necessarily more efficient than domestic enterprises, depending on the types of ownership collaboration between domestic and foreign enterprises, as well as sub-industries. To be more specific, state-owned companies with foreign partners in the food and beverage, textiles, apparel, and footwear, and energy and chemical sectors are more efficient than other ownership partnerships. The author's Hanousek et al. (2012) findings are interesting, too. They employed a panel version of a SF model for the period 1996–2007 on more than 190,000 Czech firms and discovered that concentration and foreign ownership are linked to efficiency, and that FDI has favorable microeconomic benefits. They do, however, illustrate that a simple majority is not always the ideal structure for increasing efficiency.

3. Model specification and methodology

The work on measurement through frontier models began in the late 1970s by Aigner et al (1977) and Meeusen and van den Broeck (1977). Since then, major contribution comes from Battese and Coelli (1985; 1988), Green (2005a; 2005b) and Kumbhakar et al. (2002; 2015).

In this paper, the methodology is based on 'true' random effects - TRE model (Greene, 2005a; 2005b). The model allows the separation of time-invariant unnoticed heterogeneity from the inefficiency component, which changes over time. For that reason, Greene, in accordance with the assumptions about unnoticed unit-specific heterogeneity in front of the word stochastic, added the adjective "true".

His TRE model is specified as:

$$y_{it} = (\alpha + \omega_i) + \beta' x_{it} + v_{it} - u_{it} \quad (1)$$

with distribution assumptions:

$$\begin{aligned} \omega_i &\sim N[0, \sigma_\omega^2] \\ u_{it} &\sim N^+[0, \sigma_u^2] = N^+(0, \exp(\omega_{u0} + z'_{u,it} \omega_u)) \\ v_{it} &\sim N[0, \sigma_v^2] \end{aligned}$$

where y_{it} is the log of output (in this paper, value added) for manufacturing group i at time t , α is a common intercept; ω_i is a time invariant, manufacturing group specific random term meant to capture cross group heterogeneity; x_{it} is the vector of inputs (in logs); β is the associated vector of technology parameters to be estimated; v_{it} is a random two-sided noise term (exogenous production shocks) that can increase or decrease output (*ceteris paribus*); and u_{it} is the non-negative one-sided inefficiency term.

Due to the inclusion of unobserved heterogeneity term ω_i , TRE model has advantages over 'basic' SF models - it controls for any omitted variable biases and also avoids heterogeneity biases in the estimates of technical inefficiency.

The Greene model's parameters are determined using the maximum simulated likelihood method because to its complexity. The Jondrow et al. (1982) (JLMS) result can then be used to estimate residual technical inefficiency:

$$\hat{u}_{it} = E[u_{it} | \varepsilon_{it}] = \frac{\sigma \lambda}{1 + \lambda^2} \left[\frac{\phi(a_{it})}{1 - \phi(a_{it})} - a_{it} \right] \quad (2)$$

where $\lambda = \frac{\sigma_u}{\sigma_v}$ and $\sigma = \sqrt{\sigma_v^2 + \sigma_u^2}$. It is obvious that λ is an indicator of relative variability of the sources of variation (i.e. inefficiency and statistical noise). A value of $\lambda > 1$ implies that the discrepancy between the observed and maximum attainable level of output is dominated by variability emanating from technical inefficiency. On the other hand variance parameter σ indicates whether conventional production function would be a satisfactory representation of the data used or not.

We underline that the main goal of SF models is not only to serve as a standard against which manufacturers' TE is estimated, but also to investigate how

exogenous variables (in this case, foreign ownership) influence the manufacturer's performance.

Namely, according to Battese and Coelli (1985) the technical inefficiency effect, u_i , in the SF model (1) are assumed to be a function of a set of explanatory variables associated with inefficiency of units over time:

$$u_{it} = z_{it}\delta + w_{it} \quad (3)$$

where z_{it} is vector of variables which may influence the efficiency of units, δ is vector of unknown parameters to be estimated and w_{it} are unobservable random variables which are assumed to be independently distributed and obtained by truncation of the normal distribution with zero mean and constant variance.

4. Data

This "empirical analysis utilises the balanced panel data on a sample of 92 Groups of Section C 'Manufacturing' (NACE Rev. 2 at 3-digit level), spread over 10 years period 2010-2019 (see Table 1). The data source is the Business Register of Statistical Office of the Republic of Serbia. The SF model estimates a firm's production frontier given a set of production inputs. The deviation of a firm's actual output level from its maximum level of output is defined as technical inefficiency. The variable FDI (share of foreign ownership) was used as a covariate" (Nikolić, 2020a, p.71).

Tabel 1. Summary statistics for variable used in the estimation of TRE model

Variable	Obs	Mean	Std. Dev.	Min	Max
t	920	2014,5	2,9	2010	2019
VA	920	50604,5	72784,3	-91341,1	627662,4
K	920	118515,1	196473,6	0	2254966,0
L	920	27696,1	31958,9	12,5	288688,8
M	920	115944,8	176279,2	0,2	1404700
E	920	9540,1	18933,6	2,7	297690,8
FDI	920	29,1	26,3	0,0	100,0

Source: Author's Calculation

A description of the other variables follows below:

- VA (value added): The gross value added at basic price is defined as the difference between output at basic prices and intermediate consumption at purchaser's prices (in EUR thousand);
- K: Capital (in EUR thousand);
- L (labor costs): encompass salaries, wages and other personal indemnities (in EUR thousand);
- M (material inputs): raw material costs (in EUR thousand);
- E (energy inputs): fuel and energy costs (in EUR thousand).

4. Results

Under certain assumptions, the coefficients are estimated in such a way as to maximize the reliability function (Kumbhakar and Lovell, 2000), by complex iterative procedures (with the help of the statistical program STATA).

The λ - parameter is significantly greater than zero in all specifications, showing that inefficiency effects occur. Furthermore, we use a generalised likelihood ratio test for the null hypothesis of no one-sided error to check for the presence of u_{it} in the model. The test is based on the loglikelihood (LR) values of the OLS (the restricted model) and the TRE model (the unrestricted model given in equation 1)². Although the LR test value for each sprification are 335,87; 332,04 and 315,64, respectively we strongly reject the null hypothesis in all sprifications confirming the existence of inefficiency effects and that applying the average response function with just v_{it} error term is not appropriate.

Table 2. Estimated TRE model

lnVA (dep. variable)	Model specifications		
	1.	2.	3.
<i>Stochastic frontier</i>			
<i>_Cons</i>	-28,651*** (4,7164)	-30,713*** (4,9764)	-32,835*** (6,0361)
<i>t</i>	0,016*** (0,0023)	0,017*** (0,0025)	0,018*** (0,0030)
lnK	0,277***	0,237***	0,231***

² The LR test is equal to $-2[L(H_0) - L(H_1)]$ where $L(H_0)$ and $L(H_1)$ are the log-likelihoods of the restricted and unrestricted models respectively. Tables by Kodde and Palm (1986) provide the crucial values.

	(0,0299)	(0,0296)	(0,0280)
$\ln L$	0,507***	0,417***	0,292***
	(0,0319)	(0,0384)	(0,0416)
$\ln M$	-	0,118***	0,110***
		(0,0201)	(0,0303)
$\ln E$	-	-	0,129***
			(0,0339)
<i>Technical inefficiency (effect)¹</i>			
FDI	-0,033***	-0,035***	-0,033***
	(0,0057)	(0,0059)	(0,0058)
θ	1,117***	1,165***	0,999***
	(0,0284)	(0,0309)	(0,2786)
σ_u	0,822***	0,815***	0,797***
	(0,0386)	(0,0388)	(0,0389)
σ_v	0,087***	0,095***	0,101***
	(0,0115)	(0,0106)	(0,0112)
λ	9,470***	8,539***	7,844***
	(0,0423)	(0,0424)	(0,0429)

Notes: ¹ value calculated as the sample mean; the standard error value is given in parentheses, *** denotes significance at 1%

Source: *ibidem*

Summing up, given the results in Table 2:

All coefficients have the desired sign and are statistically significant at 1% statistical level.

The coefficient with t (0.016-0,018) implies that from 2010 to 2019, the average productivity growth (ie value added for a given level of capital and engaged labor force) was 1,7% per year. This would imply that technical change played a key role in the industrial sector's productivity increase in Serbia.

The inclusion of the FDI variable in the model is also justified. A negative sign was obtained, which means that with the decrease of the share of foreign ownership in the total capital of the manufacturing, the technical inefficiency increases. The above results also indicate that the presence of foreign ownership in the same manufacturing group seems to enhance the TE of domestic firms, too.

Table 3. Average technical efficiency estimates, 2010-2019.

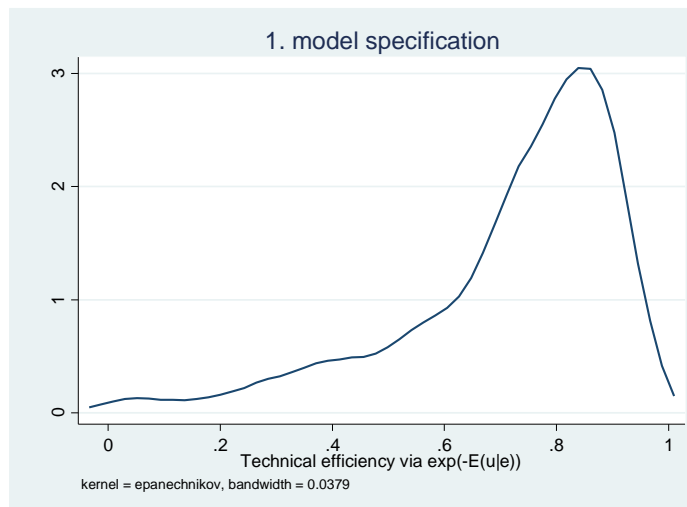
via $\exp(-E(s \cdot u|\varepsilon))$

<i>Model Spec.</i>	Obs	Mean	Std.Dev.	Min	Max
1.	899	0,7165	0,1968	0,0045	0,9712
2	899	0,7209	0,1944	0,0074	0,9716
3	899	0,7208	0,1905	0,0365	0,9709

Source: ibidem

The summary statistics of estimated TE scores (Table 3) indicate that Serbia from 2010 to 2019 lost around 28% of the potential output of the manufacturing sector due to technical inefficiency.

The findings are directly confirmed by the results at the level of the manufacturing sector's observed groupings. The largest gains in technical efficiency can be seen in industries with a high percentage of foreign ownership, such as automobile manufacturing, chemical manufacturing, and wire and cable manufacturing.



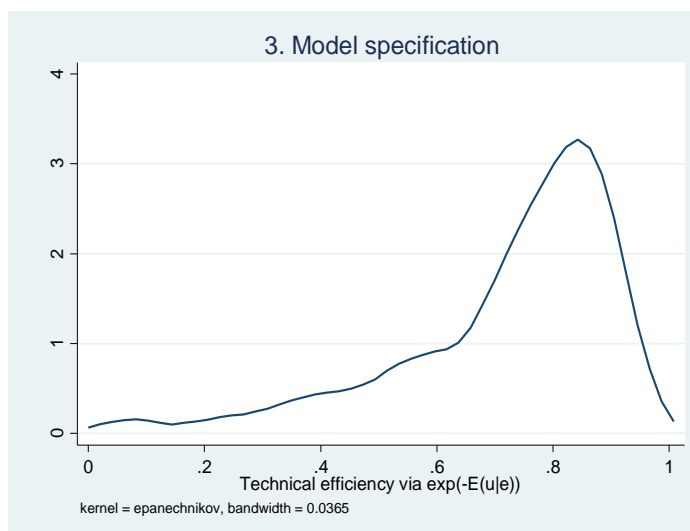
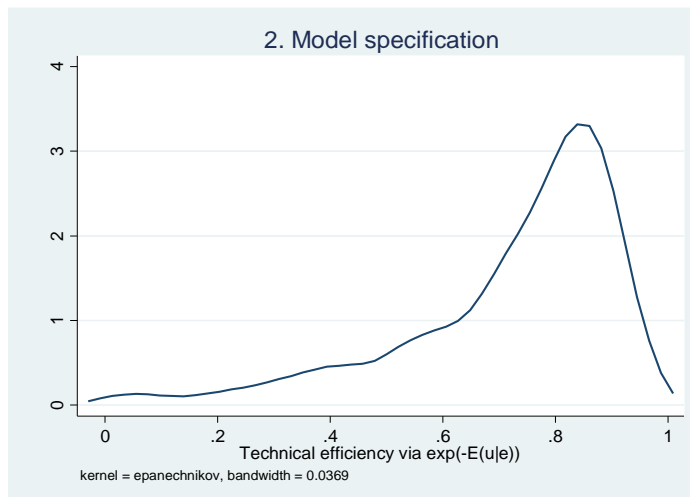


Figure 1. Kendel density estimate
Source: ibidem

The figure 1 shows Kernel density distribution of technical efficiency for for all three specifications.

5. Conclusion

Many initiatives have been taken by Serbian policymakers in the recent decade to attract FDI, with the hope that this inflow will drive export-led growth, increase employment, improve productivity, and accelerate growth. The foregoing findings suggest that foreign enterprises' presence in Serbia has a favorable impact on the indigenous industry's technological efficiency in general. However, we must be cautious, because the impacts of FDI vary by industry, and a "one-size-fits-all" investment promotion program is not suggested.

The paper contributes to a better understanding of the possible consequences of foreign-invested enterprises on the domestic economy and, in particular, the performance of local businesses. As a result, it is helpful to policymakers in developing countries, where FDI is thought to have technological spillovers on native businesses.

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