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Applying conditional DEA to measure football clubs' performance: Evidence from the top 25 European clubs

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Abstract

This paper applies a probabilistic approach to investigate how the top European football clubs' current value and debt levels influence their performance. Specifically, a bootstrapped conditional data envelopment analysis (DEA) is used in order to measure the effect of football clubs' current value and debt levels on their obtained efficiency performances. The results indicate that football clubs' current value levels have a positive influence up to a certain point. But as the current value increases the effect is neutral to football clubs' performance. At the same time, the empirical evidence suggests that there is no influence on football clubs' efficiencies associated with lower and medium football clubs' debt levels while higher debt levels appear to

have a direct negative effect.

Keywords: European football clubs; Data Envelopment Analysis; Nonparametric regression; Bootstrapping; Probabilistic approach.

JEL classification: C14, C69, L83

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I. Introduction

The economic theory behind sporting activity is based on the work of Rottenberg (1956), Neale (1964), Jones (1969) and Sloane (1969, 1971, 1976). However, Scully (1974) was the first to apply a production function in order to provide empirical evidence for the performance of baseball players. The application of frontier production function in order to measure teams' performance has been dated back on the works of Zak *et al.* (1979), Porter and Scully (1982) and Fizel and D'Itri (1996, 1997). Dawson *et al.* (2000) had applied a stochastic frontier approach (SFA), measuring managers' efficiency for a panel of managers in English Football (soccer) Premier league. Haas (2003a, 2003b) applied data envelopment analysis (DEA) measuring team efficiency of the USA Major League Soccer (MLS) and for twenty English Premier League clubs. Barros and Leach (2006a, 2006b, 2007) applying a stochastic Cobb-Douglas production frontier and DEA measured the performance of football clubs in the English F.A. Premier League. More recently Barros and Garciadel-Barrio (2011) and García-Rubio et al. (2011) used DEA methodology in order to determine the factors influencing Spanish football teams' performance levels.

Our study, similarly to the ones already mentioned, by applying for the first time conditional DEA efficiency estimates (Daraio and Simar, 2005, 2006, 2007a, 2007b) investigates how clubs' value and debt levels influence their performances. In contrast to the main research stream, instead of using data of a specific national football league, our study uses a sample of the top 25 European football clubs and proposes a composite index as output based on several long term football clubs' success factors.

II. Data and Methodology

All the data are extracted from Forbes database (2010) and concern data recorded for the year 2009. In our DEA formulation we use one input and one composite output. The input used is football clubs' revenues (measured in millions \$) and one composite output which measures football clubs European and domestic trophies. The composite output contains the sum of the number of European champions' cups (weighted by 5), UEFA cups/ Euroleague cups (weighted by 4), European cup winners' cups (weighted by 3), Intercontinental cups (weighted by 3) and FIFA Club World cups (weighted by 3).

In addition the composite output contains also the sum of the number of domestic championships (weighted by 2) and domestic cups (weighted by 1). Both the number of the weighted domestic champions and domestic cups (includes all domestic cups, i.e. super cups, league cups, national cups, etc) are again weighted by FIFA world ranking score (FIFA, 2010). This extra weight has been added in order to reflect the different difficulty levels of obtaining a domestic cup and/ or championship among the different European leagues¹. We also assume that club revenues are used from the clubs in order to buy the best (in term of football quality) possible managers and players which can lead to team success (based on world, European and domestic championships and cups).

Recent studies for the English Premier League suggest that revenues are related to clubs' success (Hickman et al., 2008; Carmichael et al., 2010). Moving a step ahead and by applying a conditional efficiency measurement approach we examine in what way European football clubs' current value (CurrVal- Z_1) and debt levels (Debt- Z_2) (measured in millions of \$) affect their obtained efficiency levels.

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¹ We assume that it is not of the same difficulty to obtain a domestic championship or cup between the English, the Scottish, the Spanish, the German and the Italian football league. All the weights used in order for the composite output to be constructed are subjective and can be subject to criticism.

Table 1 presents the descriptive statistics of the variables used in our study. As can be realized table 1 reports several variations of the variables used indicated by the high standard deviation values. Finally, in our DEA setting we assume an output orientation suggesting by how much football clubs can increase their output while keeping the level of inputs fixed.

Table 1: Descriptive statistics of the variables used

	External	Input								
	Current Value(\$mil)	Debt(\$mil)	Revenue (\$mil)							
Mean	597.080	218.238	274.720							
Std	443.374	338.197	128.008							
Min	194.000	0.002	128.000							
Max	1870.000	1284.000	576.000							
	Output components									
	Intercontinental Cup	FIFA Club World Cup	Domestic Championships							
Mean	0.56	0.08	13.80							
Std	1.00	0.28	12.70							
Min	0.00	0.00	2.00							
Max	3.00	1.00	51.00							
	Output components									
	European Champions Cups	Uefa Cups/Euroleague Cups	European Cup Winners Cup							
Mean	1.600	0.840	0.800							
Std	2.432	1.143	0.913							
Min	0.000	0.000	0.000							
Max	9.000	3.000	4.000							
	Output components									
	Domestic Cups	FiFA country Ranking	Composite Output							
Mean	13.48	7.04	27.29							
Std	13.04	8.88	33.82							
Min	2.00	1.00	1.46							
Max	57.00	35.00	142.00							

Based on the work by Koopmans (1951) and Debreu (1951) the production set Ψ constraints the production process and is the set of physically attainable points (x,y):

$$\Psi = \left\{ (x, y) \in \mathfrak{R}_{+}^{N+M} \middle| x \quad can \quad produce \quad y \right\}$$
 (1),

where $x \in \mathfrak{R}_{+}^{N}$ is the input vector and $y \in \mathfrak{R}_{+}^{M}$ is the output vector.

Then the output oriented efficiency boundary $\partial Y(x)$ is defined for a given $x \in \mathfrak{R}_+^N$ as:

$$\partial Y(x) = \{ y | y \in Y(x), \lambda y \notin Y(x), \forall \lambda > 1 \}, \tag{2}$$

and the Debreu-Farrell output measure of efficiency for a production unit can be defined as:

$$\lambda(x,y) = \sup \left\{ \lambda | (x,\lambda y) \in \Psi \right\}$$
 (3).

In equation (3) by construction $\lambda(x,y) \ge 1$ and technical efficiency is achieved when $\lambda(x,y) = 1$. As suggested by several authors (Førsund and Sarafoglou, 2002; Førsund *et al.*, 2009), Hoffman's (1957) discussion regarding Farrell's (1957) paper was the first to indicate that linear programming can be used in order to find the frontier and estimate efficiency scores, but only for the single output case. Later, Boles (1967, 1971) developed the formal linear programming problem with multiple outputs identical to the constant returns to scale (CRS) model in Charnes *et al.* (1978) who named the technique as data envelopment analysis (DEA).

Following Zelenyuk and Zheka (2006, p.149) we apply the assumption of CRS due to the fact that it enables to obtain greater discriminative power, which in turn would result in larger variation of the regressand. In addition, since we examine the 25 European football clubs with the highest values, we are not expecting great differences among their sizes. This formulation can be expressed as:

$$\hat{\Psi}_{CRS} = \left\{ (x, y) \in \Re^{N+M} \middle| y \le \sum_{i=1}^{n} \gamma_i y_i; x \ge \sum_{i=1}^{n} \gamma_i x_i \text{ for } (\gamma_1, ..., \gamma_n) \right\}$$
such that $\gamma_i \ge 0, i = 1, ..., n$ (4).

which then can be computed by solving the following linear program:

$$\hat{\lambda}_{CRS} = \sup \left\{ \lambda \middle| \lambda y \le \sum_{i=1}^{n} \gamma_{i} y_{i}; x \ge \sum_{i=1}^{n} \gamma_{i} x_{i} \text{ for } (\gamma_{1}, ..., \gamma_{n}) \right\}$$
such that $\gamma_{i} \ge 0, i = 1, ..., n$ (5).

II.1 A bootstrap approach for bias correction of the efficiency estimator

Simar and Wilson (1998, 2000, 2008) suggest that DEA estimators were shown to be biased by construction. They introduced an approach based on bootstrap techniques (Efron, 1979) to correct and estimate the bias of the DEA efficiency indicators. The bootstrap bias estimate for the original DEA estimator $\hat{\lambda}_{CRS}(x, y)$ can be calculated as:

$$\widehat{BIAS}_{B}\left(\widehat{\lambda}_{CRS}(x,y)\right) = B^{-1} \sum_{b=1}^{B} \widehat{\lambda}^{*}_{CRS,b}(x,y) - \widehat{\lambda}_{CRS}(x,y)$$
(6).

Furthermore, $\hat{\lambda}^*_{CRS,b}(x,y)$ are the bootstrap values and B is the number of bootstrap replications (2000 replications has been used). Then a biased corrected estimator of $\lambda(x,y)$ can be calculated as:

$$\hat{\hat{\lambda}}_{CRS}(x,y) = \hat{\lambda}_{CRS}(x,y) - B\hat{I}AS_B \left(\hat{\lambda}_{CRS}(x,y)\right)$$

$$= 2\hat{\lambda}_{CRS}(x,y) - B^{-1}\sum_{b=1}^{B}\hat{\lambda}^*_{CRS,b}(x,y)$$
(7).

Following the conditional efficiency estimators Daraio and Simar (2005, 2006, 2007a, 2007b) and the theoretical background of their statistical properties (Jeong et al. 2010) the conditional output efficiency measure can be defined as:

$$\lambda(x, y|z) = \sup \{\lambda | S_{Y|X,Z}(\lambda y|x, z) > 0\}$$
(8),

where $Z \in \Re^r$ denotes the external variables. Then the conditional survival function introduced in (8) can be estimated as:

$$\hat{S}_{Y|X,Z}(y|x,z) = \frac{\sum_{i=1}^{n} I(Y_i \ge y, X_i \le x) K_h(Z_i, z)}{\sum_{i=1}^{n} I(X_i \le x) K_h(Z_i, z)}$$
(9).

In equation (9) K(.) is the Epanechnikov kernel and h is the bandwidth, which has been calculated following a fully automatic data-driven approach as has been indicated by Bădin et al. (2010). Since our external variables (Z_1 and Z_2) are correlated (Pearson correlation = 0.65, P-value=0.000) and this will lead us to biased conditional efficiency estimates, we apply the Mahalanobis transformation (Mardia et al., 1979), following Cherchye et al. (2007) in order to de-correlate the variables and thus to apply a sequential kernel estimation as if all external variables were independently distributed. This will enable us to observe separately the effect of the external variables on the obtained efficiency estimates.

Then in order to establish the influence of an external variable on the efficiency scores obtained a scatter of the ratios $Q_Z \frac{\hat{\lambda}_n(x,y|z)}{\hat{\lambda}_n(x,y)}$ against Z (in our case

as mentioned there are two external factors) and its smoothed non-parametric regression line it would help us to analyse the effect of Z on the European football teams' performance. Following Racine (2008) we use a known local polynomial method due to the fact that does not suffer from edge bias and can enable us to describe better the underlying data generating process (DGP) compared to the local constant estimator (Nadaraya, 1965; Watson, 1964). According to Daraio and Simar (2005) if the regression line is increasing it indicates that Z is unfavourable to the teams' efficiency levels whereas if it is decreasing then it is favourable.

III. Empirical results and conclusions

Following the methodology presented previously, Table 2 presents the results obtained of the efficiency analysis under the CRS assumption. The European football clubs are presented in table 2 in a descending order based on their current values. The second column represents the original efficiency estimates $(\hat{\lambda}_{DEA}(x,y))$, whereas the third represents their biased corrected efficiency estimates $(\hat{\lambda}_{DEA,BC}(x,y))$. Similarly, the conditional efficiency scores on football clubs' current value levels $(\hat{\lambda}_{DEA}(x,y|z_1))$ are presented in the fourth column alongside side with their biased corrected conditional efficiency estimates $(\hat{\lambda}_{DEA,BC}(x,y|z_1))$. Finally, the last two columns present the conditional on debt efficiency estimates $(\hat{\lambda}_{DEA,BC}(x,y|z_2))$ and their biased corrected conditional efficiency estimates $(\hat{\lambda}_{DEA,BC}(x,y|z_2))$.

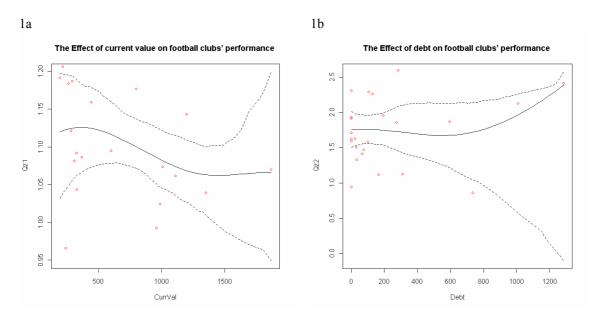
As can be realized from the descriptive values, football clubs' current value and debt levels appear to decrease their performance levels (in average terms) both for original and biased corrected estimates. In addition high standard deviation values have been reported for all the efficiency estimators indicating high performance variations among the European football clubs. Figure 1 illustrates the nonparametric estimates of the regression functions (using the conditional and unconditional biased corrected CRS efficiency estimates) and their variability bounds of pointwise error bars using asymptotic standard error (Hayfield and Racine, 2008).

Table 2: Efficiency scores of conditional and unconditional measures

Football Clubs	$\hat{\lambda}_{DEA}(x,y)$	$\hat{\lambda}_{DEA,BC}(x,y)$	$\hat{\lambda}_{DEA}(x,y z_1)$	$\hat{\lambda}_{DEA,BC}\left(x,y z_{1}\right)$	$\hat{\lambda}_{DEA}(x,y z_2)$	$\hat{\lambda}_{DEA,BC}\left(x,y z_{2}\right)$
Manchester United FC	1.681	1.773	1.766	1.896	3.051	3.768
Real Madrid FC	1.000	1.209	1.000	1.256	1.000	1.352
Arsenal FC	1.752	1.814	1.974	2.073	3.836	4.367
Bayern Munich FC	1.350	1.449	1.400	1.538	1.198	1.366
Liverpool FC	1.141	1.198	1.203	1.286	1.879	2.231
AC Milan FC	1.051	1.112	1.060	1.138	1.493	1.765
Barcelona FC	1.051	1.186	1.014	1.177	1.274	1.672
Chelsea FC	2.380	2.457	2.759	2.891	1.949	2.110
Juventus FC	1.053	1.096	1.135	1.201	2.588	3.189
Schalke 04 FC	1.511	1.560	1.838	1.925	2.783	3.044
Tottenham Hotspur FC	1.342	1.384	1.532	1.605	2.816	3.126
Olympique Lyonnais FC	1.914	2.040	2.510	2.693	2.770	2.986
AS Roma FC	1.902	1.971	2.366	2.490	2.422	2.618
Internazionale Milan FC	1.097	1.142	1.174	1.241	2.469	2.962
Hamburg SV FC	1.269	1.309	1.301	1.366	2.736	3.016
Borussia Dortmund FC	1.130	1.166	1.215	1.273	2.417	2.669
Manchester City FC	1.281	1.374	1.377	1.485	2.062	2.225
Werder Bremen FC	1.279	1.331	1.486	1.580	2.350	2.546
Newcastle United FC	1.429	1.486	1.561	1.666	2.545	2.756
VfB Stuttgart FC	1.375	1.471	1.615	1.741	2.329	2.513
Aston Villa FC	1.092	1.137	1.000	1.098	1.707	1.845
Olympique Marseille FC	1.461	1.523	1.093	1.180	2.715	2.940
Celtic FC	1.079	1.133	1.274	1.367	1.577	1.703
Everton FC	1.115	1.168	1.325	1.415	1.704	1.841
Glasgow Rangers FC	1.000	1.075	1.175	1.281	1.114	1.201
Mean	1.349	1.423	1.486	1.594	2.191	2.472
Std	0.346	0.350	0.480	0.491	0.693	0.779
Min	1.000	1.075	1.000	1.098	1.000	1.201
Max	2.380	2.457	2.759	2.891	3.836	4.367

The results indicate that football clubs' current value levels (subfigure 1a) have a positive value up to a certain point. However as the current value increases the effect is neutral to football clubs' performance. In addition it is reported that extremely high football clubs' current values may have even a negative value on football clubs' performance. In addition it appears that lower to medium levels of football clubs' debt levels (subfigure 1b) has a neutral effect on football clubs' performance. However there are strong evidences that higher debt values can affect negatively football clubs' efficiency levels.

Figure 1: Graphical representation of the global effect of current value (CurrVal) and debt (Debt) on football clubs' performance



Finally, in terms of policy implications it appears that when comparing the top European football clubs, their determinants of higher efficiency (in terms of the number of domestic and European club trophies) are not based on their higher revenue and value levels. The conditional DEA approach proved to be a vital tool for showing that other factors like managerial efficiency (Fizel and D'Itri, 1996, 1997; Dawson *et al.*, 2000) and team spirit (Scully, 1974) may be more important when comparing the top European football clubs.

References

Bădin, L., Daraio, C. and Simar, L. (2010) Optimal bandwidth selection for conditional efficiency measures: A Data-driven approach, *European Journal of Operational Research*, **201**, 633-640.

Barros, C. P. and Leach, S. (2006a). Analyzing the performance of the English F.A. Premier league with an econometric frontier model, *Journal of Sports Economics*, 7, 391-407.

Barros, C. P. and Leach, S. (2006b) Performance evaluation of the English premier league with data envelopment analysis, *Applied Economics*, **38**, 1449-1458.

Barros, C. P. and Leach, S. (2007) Technical efficiency in the English football association premier league with a stochastic cost frontier, *Applied Economics Letters*, **14**, 731-741.

Barros, C.P. and Garcia-del-Barrio, P. (2011) Productivity drivers and market dynamics in the Spanish first division football league, *Journal of Productivity Analysis*, **35**, 5-13.

Boles, J.N. (1967) Efficiency squared—efficient computation of efficiency indexes, Western Farm Economic Association Proceedings 1966, 137–142.

Boles, J.N. (1971) *The 1130 Farrell efficiency system–multiple products, multiple factors*. Giannini Foundation of Agricultural Economics, University of California, Berkeley, USA.

Carmichael, F., McHale, I. and Thomas, D. (2010) Maintaining market position: team performance, revenue and wage expenditure in the English premier league, *Bulletin of Economic Research*, doi: 10.1111/j.1467-8586.2009.00340.x.

Charnes, A., Cooper, W.W. and Rhodes, E.L. (1978) Measuring the efficiency of decision making units, *European Journal of Operational Research*, **2**, 429-444.

Cherchye, L., De Witte, K. and Ooghe, E. (2007) Equity and efficiency in private and public education: a nonparametric comparison. Discussions Paper Series (DPS) 07.25. Centre for Economic Studies, University of Leuven, Belgium.

Daraio, C. and Simar, L. (2005) Introducing environmental variables in nonparametric frontier models: a probabilistic approach, *Journal of Productivity Analysis*, **24**, 93–121.

Daraio, C. and Simar, L. (2006) A robust nonparametric approach to evaluate and explain the performance of mutual funds, *European Journal of Operational Research*, **175**, 516–542.

Daraio, C. and Simar, L. (2007a) Advanced robust and nonparametric methods in efficiency analysis, Springer, NewYork.

Daraio, C. and Simar, L. (2007b) Conditional nonparametric frontier models for convex and nonconvex technologies: a unifying approach, *Journal of Productivity Analysis*, **28**, 13–32.

Dawson, P., Dobson, S. and Gerrard, B. (2000) Stochastic frontiers and the temporal structure of managerial efficiency in English soccer, *Journal of Sport Economics*, 1, pp. 341-362.

Debreu, G. (1951) The coefficient of resource utilization, *Econometrics*, **19**, 273–292. Efron, B. (1979) Bootstrap methods: another look at the jackknife, *Annals of Statistics*, **7**, 1-16.

Farrell, M. (1957) The measurement of productive efficiency, *Journal of the Royal Statistical Society Series A*, **120**, 253–281.

FIFA, (2010). FIFA/Coca-Cola world ranking. Available at http://www.fifa.com/worldfootball/ranking/lastranking/gender=m/fullranking.html#confederation=27275&rank=203 (accessed 13 September 2010).

Fizel, J.L. and D'Itri, M.P. (1996) Estimating managerial efficiency: the case of college basketball coaches, *Journal of Sport Management*, **10**, 435–445.

Fizel, J.L. and D'Itri, M.P. (1997) Managerial efficiency, managerial succession and organizational performance, *Managerial and Decision Economic*, **18**, 295–308.

Forbes (2010). Soccer Team Valuations, Special report. Available at http://www.forbes.com/lists/2009/34/soccer-values-09_Soccer-Team-Valuations_Rank.html (accessed 13 September 2010).

Førsund, F.R. and Sarafoglou, N. (2002) On the origins of Data Envelopment Analysis, *Journal of the Productivity Analysis*, **17**, 23-40.

Førsund, F.R., Kittelsen, S.A.C. and Krivonozhko, V.E. (2009) Farrell revisited–Visualizing properties of DEA production frontiers, *Journal of the Operational Research Society*, **60**, 1535-1545.

García-Rubio, M.A., Picazo-Tadeo, A.J. and González-Gómez, F. (2011) Does a red shirt improve sporting performance? Evidence from Spanish football, *Applied Economics Letters*, doi: 10.1080/13504851.2010.520666.

Haas, D.J. (2003a) Technical efficiency in the major league soccer, *Journal of Sport Economics*, **4**, 203-215.

Haas, D.J. (2003b) Productive efficiency of English football teams-A data envelopment analysis approach, *Managerial and Decision Economics*, **24**, 403-410.

Hayfield, T. and Racine, J. C. (2008) Nonparametric econometrics: The np Package, *Journal of Statistical Software*, **27**,1-32. Hickman, K.A., Cooper, S.M., Ampomah, S.A. (2008) Estimating the value of victory: English football, *Applied Economics Letters*, **4**, 299-302.

Hoffman, A. J. (1957) Discussion on Mr. Farrell's Paper, *Journal of the Royal Statistical Society Series A*, **120**, 282-284.

Jeong, S.O., Park, B.U. and Simar, L. (2010) Nonparametric conditional efficiency measures: asymptotic properties, *Annals of Operational Research*, **173**, 105-122.

Jones, J.C.H. (1969). The Economics of the National Hockey League, *Canadian Journal of Economics*, **2**, 1-20.

Koopmans, T.C. (1951) *An analysis of production as an efficient combination of activities*, in Koopmans, T.C. (ed) Activity analysis of production and allocation. New York: Wiley, pp. 33–97.

Mardia, K.V., Kent, J.T. and Bibby, J.M. (1979) *Multivariate Analysis*. Academic Press, NewYork.

Nadaraya, E.A. (1965) On nonparametric estimates of density functions and regression curves, *Theory of Applied Probability*, **10**, 186–190.

Neale, W. (1964) The peculiar economics of professional sports, *Quarterly Journal of Economics*, **78**, 1-14.

Porter, P. and Scully, G.W. (1982) Measuring managerial efficiency: The case of baseball, *Southern Economic Journal*, **48**, 642-650.

Racine, J.S. (2008) Nonparametric Econometrics. Foundation and Trends in Econometrics, 3, 1-88.

Rottenberg, S. (1956) The baseball player's labor-market, *Journal of Political Economy*, **64**, 242-258.

Scully, G.W. (1974) Pay and performance in major league baseball, *American Economic Review*, **64**, 915-930.

Simar, L. and Wilson, P.W. (2008) Statistical interference in nonparametric frontier models: recent developments and perspectives, in *The measurement of productive efficiency and productivity change*, (Eds) H. Fried, C.A.K. Lovell and S. Schmidt, Oxford University Press, New York, pp. 421-522.

Simar, L. and Wilson, P.W. (2000) A general methodology for bootstrapping in non-parametric frontier models, *Journal of Applied Statistics*, **27**, 779 -802.

Simar, L. and Wilson, P.W. (1998) Sensitivity Analysis of Efficiency Scores: How to Bootstrap in Nonparametric Frontier Models, *Management Science*, **44**, 49–61.

Sloan, P.J. (1969) The labour market in professional football, *British Journal of Industrial Relations*, **7**, 181-199.

Sloan, P.J. (1976) Restriction of competition in professional team sports, *Bulleting of Economic Research*, **28**, 3-22.

Sloane, P. (1971) The economics of professional football: The football club as a utility maximiser, *Scottish Journal of Political Economy*, **17**,121-146.

Watson, G.S. (1964) Smooth regression analysis. Sankhya 26, 359–372.

Zak, T. A., Huang, C. J. and Siegfried, J. J. (1979) Production efficiency: The case of professional basketball, *Journal of Business*, **52**, 379-392.

Zelenyuk, V. and Zheka, V. (2006) Corporate governance and firm's efficiency: the case of a transitional country, Ukraine, *Journal of Productivity Analysis*, **25**, 143-157.