A New Approach to the Evaluation of Public Procurement Efficiency among European Countries

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Public procurements have been high on the agenda of policy makers, decision makers, scholars, and other interested parties in Europe in the last few decades, as such procurements make up nearly one-fifth of Europe's total gross domestic product. Nevertheless, not many attempts have been made to measure the efficiency of public procurement systems and accordingly rank European countries. The most important measurement that highlights this issue is the Single Market Scoreboard for Public Procurements. However, this scoreboard is subject to bias and numerous omissions, which significantly decreases its operational usage and deteriorates the real efficiency of public procurements. This article aims to rank European countries in an unambiguous, objective, and impartial manner by using the Composite I-distance Indicator (CIDI) methodology. Instead of using biased weights for individual indicators, assigned by experts, the CIDI method creates new weights in an objective manner. The study analysed 30 European countries. The results of the study are, to some extent, different from current practice for public procurement efficiency measurement. The novel approach to ranking provides an opportunity to interested parties to improve the performance of their public procurements by reviewing them on a multidimensional basis.

Introduction

The efficiency of public procurements plays a significant role in the EU Member States, as such procurements made up around 20% of GDP in the European Union in the period 2009–2011.¹ Hitherto, public procurements have received substantial attention from researchers aiming to improve both the efficiency of public procurements and the measurement scale.^{2–4} Alongside the scholarly efforts, public authorities, as well as national and international agencies have also been active in the field.

For instance, the European Commission regularly conducts a six-item Single Market Scoreboard analysis of the efficiency of public procurements within European countries and provides various recommendations for improvements.⁵ However, these and other metrics are biased with subjectivity and suffer from omissions that could mislead policy makers, decision makers, and other interested parties. Consequently, composite indices based on the holistic, international ranking of public procurement efficiency have been out of the scope of current research and policies. Bearing in mind the importance of composite indices for research nowadays,⁶ any lack of evidence in this field is a strong motivation for an in-depth analysis.

This study aims to fill the lacuna in the extant body of knowledge by ranking European countries in an unambiguous manner. Measuring the entities in order to evaluate, compare, and rank them is an important cause and objective.⁷ 'A natural instinct for humans is to make comparisons, [...] These comparisons are important because rank position effects [sic] an individual's beliefs about themselves and their abilities'.⁸ Likewise, the objectivity in measuring is also important. Any subjectivity in the creation of composite indicators may affect the measurement to a great extent.⁹ Consequently, the main purpose of this study is to measure in an objective manner, using the Composite I-Distance Indicator (CIDI) methodology,¹⁰ the efficiency of public procurements, progress in procurement practices, differences among European countries, and development potentials.

To the best of the authors' knowledge, a study of this kind has never been conducted before. First, there are only a few scholarly attempts to assess and rank public procurement policies and effects across the European continent, but their emphasis is not holistic.¹¹ Second, no study attempts to challenge the current public procurement policy scoreboard set by the European Commission. Moreover, there is a paucity of quantitative studies of any kind in the field.^{12,13}

The remainder of this article is structured in the following order: The next section draws on theory, policies, and existing public procurement efficiency measures. The third section elaborates on the methodology used in this paper, placing emphasis on the CIDI methodology. The fourth section presents the results of an international analysis, thoroughly discusses the results, and puts a focus on strengths, limitations, implications, and recommendations of the study. Finally, the fifth section is reserved for concluding remarks.

Public Procurement Efficiency Measures

Public procurements are public agencies' purchases of goods and/or services from an outside body.¹⁴ The primary objective of public agencies is 'to obtain goods and services of the required quality at a competitive price.'¹⁵

Public procurements have received strategic importance in the EU by the 2011 Single Market, which has put a new emphasis on liberalized and integrated public procurements.¹⁶ The rationale for a strategic focus on public procurements is clear – they can serve for numerous policy ends. To name a few, public procurements are important for the convergence and integration of the European market,¹⁷ they shape

economic development,¹⁸ stimulate the development and diffusion of innovations,^{19–22} foster sustainability,²³ and affect market favouritism towards large, domestic, or any other classes of suppliers.²⁴

In spite of supranational legal and organizational stimulus, the value and importance of public procurements significantly differs across the European continent – accounting for 10.5% in Cyprus to 30.6% in the Netherlands.²⁵ Still, there is no country where they are viewed merely as a technical purchase of services and goods; instead, they generally serve as a nationwide resource allocator and a means of capital transfer.²⁶ Not surprisingly, public procurement systems have been a focal point of regulators, policy makers, decision makers, and other interested parties. The system is heavily regulated and monitored, both nationally and through international agencies.²⁷

Most commonly, public sector buyers are forced by regulation to use fixed-price open auctions in order to secure a competitive bidding.²⁸ The legacy of public sector contracting is to adopt an arms-length approach, foster market mechanisms, and avoid any partnering.²⁹ Procurement procedures with one or only few bidders can raise the question of efficiency and possibly of corruptive behaviour. Academic voices are not unanimous in promoting competitiveness by simply increasing the number of bidders. By challenging public and private-sector behaviour patterns in procurements, they argue that more suppliers means higher transaction costs and greater inefficiency.³⁰ Accordingly, the number of bidders seems to be a solid measure of the competitive efficiency of public procurements, but the role of such indicators should always be viewed with a dose of professional scepticism.

Public procurements should be shaped in order to enable economies of scale, which can only be achieved with the adequate level of procurement aggregation. This implies that procurements should not be heavily decentralized and departmentalized. However, this is probably the most ambiguous determinant of public procurement efficiency. Even though aggregation can boost economies of scale, EU Member States are advocated to decentralize public procurements so that local small and medium-sized enterprises can more easily access tender procedures and benefit from the stability, reliability, certainty of payment, and marketing opportunities.¹⁸ Aggregation is important for efficiency, but should not be isolated as the only efficiency factor.

Award criteria are another important driver of the efficiency of public procurement. The lowest price is most often used as a single criterion for public purchases.³¹ However, the lowest procurement price can jeopardize the quality of purchased goods, services and works. As indicated in Verdaux,³² the EU is promoting a combination of price and quality as award criteria in public procurement. This practice is endorsed by scholars who tend to provide theoretical and empirical arguments for the diversified usage of different criteria in the procurement decision-making process.³³ These arguments are sometimes referred to as 'economies of quality', as they can deliver the economic, environmental, and social benefits of sustainable development.³⁴ The procedure of tendering for goods, services, and works is supposed to be as transparent as possible, in order to minimize information asymmetries. Evenett and Hoekman³⁵ explain that 'opaque procurement practices may result from either administrative inefficiencies, the absence of hard budget constraints and oversight by the Ministry of Finance, or rent-seeking and corruption'. A transparent procurement regime improves procedures, limits manoeuvring space for corruption, and increases the potential for the development of control mechanisms. However, this might not always be the case. For instance, Lennefors³⁶ finds that in a corruptive environment, purchaser and supplier are more informed parties than regulators (i.e. courts), and transparency, in this case, will not lead to the efficiency.

Methodology

Single Market Scoreboard for Public Procurement Efficiency Measurement

A paucity of efforts has been undertaken so far with regards to the evaluation of public procurement efficiency among European countries. Strand *et al.*³⁷ examined various factors, such as patterns of use, cost and effectiveness of public procurements in the EU. Nevertheless, this study does not provide any aggregated scores for the analysed countries. Milosavljević *et al.*³⁸ used the Data Envelopment Analysis approach to estimate the input–output efficiency of public procurements among European countries, thus reflecting on the relationship between resources invested and the effects of public procurement systems. Although the study ranks countries, the ranking is biased by the selection of inputs.

The most prominent composite metrics for the evaluation is proposed by the European Commission Single Market Scoreboard.⁵ The Scoreboard incorporates six indicators, listed and explained as follows.

- One bidder measures the proportion of contract awards with just one bidder. Owing to different reporting patterns, framework agreements must be excluded. A higher value of this indicator leads to better value for money, offering more options to public buyers.
- (2) No calls for bids measures the proportion of procurement procedures that were negotiated with one selected company without a call for the tender being announced. Calling for bids contributes to the transparency of the bidder selection process and encourages competition.
- (3) Aggregation measures the proportion of procurement procedures with more than one public buyer. An aggregated network of buyers provides better prices and fosters the exchange of know-how.
- (4) Award criteria measures the proportion of procurement procedures where the lowest price was the only criterion for the bidder selection process. Excessive reliance on price indicates that opportunity for finding better quality criteria is being missed.

- (5) Decision speed measures the time between the deadline for receipt of offers and the award of the contract. Slow decision-making leads to uncertainty and increases the cost of procurement procedures.
- (6) Reporting quality measures the proportion of contract awards without information about the awarded contract's value. This indicator excludes framework agreements. A higher value of this indicator represents better bidding decision-making and citizens' insights into the way their money is spent.

Using the biased weights and thresholds that are mostly based on expert judgements, the scoreboard delivers a ranking for 30 European countries and categorizes them into three tiers (above average, average, and below average). However, this scoreboard is subject to many omissions. A notorious one is related to the use of subjective weights and thresholds, which creates numerous biases in the interpretation of results. For instance, the highest weight (tripled score) is given to two indicators – *Number of bidders* and *Number of calls for bids*, assumingly due to their indication of competitiveness efficiency. The second two indicators – *Aggregation* and *Award criteria* – are doubled, as they reflect on the system level efficiency. Finally, *Decision speed* and *Reporting quality* are seen as the representation of technical efficiency with minimal weights.

Composite I-distance Indicator

A significant number of various publicly known ranking methodologies, regardless of their subject area, have been criticized because of their obvious bias and subjectivity. This problem has been successfully addressed by some authors who propose the I-distance^{39–41} and CIDI (Composite I-distance Indicator) methodologies.^{10, 42–44}

The main idea of the CIDI methodology is to construct a composite indicator that is unbiased and impartial. CIDIs are formed using the additive aggregation method, but instead of using biased weights, the used weights are created in an objective manner. Namely, most of the ranking methodologies use weights that are assigned by experts and which are formed according to their subjective opinion on the importance of individual indicators. Weights created by CIDI are based on the I-distance methodology, which has the specific property of sorting indicators in their order of importance for a total ranking.

I-distance relies on calculating the mutual distances between the processed entities and with regard to the one entity that is set as the reference.45–48 The I-Distance D^2 is calculated by the following formula:^{49,50}

$$D^{2}(r,s) = \sum_{i=1}^{k} \frac{d_{i}^{2}(r,s)}{\sigma_{i=1}^{2}} \prod_{j=1}^{i=1} (1 - r_{ji.12...j-1}^{2})$$

where $d_i(r,s) = x_{ir} - x_{is}$ is the distance between the values of the variable $X_i(i = 1, 2, ..., k)$ for entities $e_r = (x_{1r}, x_{2r}, ..., x_{kr})$ and $e_s = (x_{1s}, x_{2s}, ..., x_{ks})$, σ_i is the standard deviation of X_i , and $r_{ji,12...,j-1}$ is a partial coefficient of the correlation between X_i and X_j , (j < i). After calculating the I-distance, it is possible to establish the correlations between its values and each of the individual compounding indicators. Correlations are used because of a particular feature of the I-distance method: it can determine the relevance of input indicators.^{7,10} Weights are formed by weighting empirical correlations: values of correlations are divided by the sum of correlations. The final sum equals 1, thus creating a novel appropriate weighting system.¹⁰

$$w_i = \frac{r_i}{\sum\limits_{j=1}^k r_j}$$

where r_i (i = 1, 2, ...k) is a Pearson correlation between X_i and the I-distance value. One of the most important features of the CIDI thus defined is that it is widely applicable to any ranking methodology if the goal is to overcome the negative influence of bias.

Results and Discussion

Country Rankings

The first step in creating a new original ranking of countries in the field of public procurements is the normalization of the data.⁵¹ The six indicators used to measure public procurement efficiency are measured differently and even have different directionalities. The directionality of the original indicators *One bidder*, *No calls for bids*, *Award criteria*, and *Decision Speed* is such that the lower the value the better the placement, while the situation for *Aggregation* and *Reporting quality* is the opposite. All indicators are converted to the same directionality and normalized using the Min-Max methodology.⁵¹

As described above, the new unbiased and impartial weights are calculated using the CIDI methodology. They are given in Table 1, in comparison with the original weights defined by experts.

As displayed in Table 1, the largest weight of 21.5% is obtained for the indicator *Reporting quality*. Next in line is *One bidder* with 19%, followed by *No calls for bids* at

Indicator	Original weights	CIDI weights	
One bidder	3/12 (25.0%)	19.0%	
No calls for bids	3/12 (25.0%)	16.8%	
Aggregation	2/12 (16.7%)	14.1%	
Award criteria	2/12 (16.7%)	14.1%	
Decision speed	1/12 (8.3%)	14.5%	
Reporting quality	1/12 (8.3%)	21.5%	

Table	1.	Individual	indicators,	original	weights and	unbiased	CIDI	weights
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16.8%. The indicators *Aggregation*, *Award criteria* and *Decision Speed* are weighted very similarly according to CIDI.

It is instructive to compare and discuss the differences in the original weights and weights obtained according to the CIDI methodology. As mentioned above, original weights are not given in percent. They indicate how many times one indicator is more significant than the other. Original weights are assigned to indicators by experts. The situation with the objective and data-driven weights obtained by CIDI is completely different. For example, as opposed to *One bidder* being three times more significant than *Reporting quality*, the latter is even more significant than the former given that it has a larger CIDI weight. It is important to note that the values for the original weights are not supported or reinforced by the literature review. In other words, there is no theoretical background to uphold the given weights, while CIDI weights are, as explained in the methodology section, data-driven.

The ranking results obtained by the CIDI methodology are given in Table 2. These results are compared with the original ranks (groups) from the Single Market Scoreboard.

For the purpose of higher comparability of results, countries were grouped into three tiers (ranks 1–10, 11–20 and 21–30) according to the CIDI rankings. The tiers are provisional and formed exclusively for the purpose of comparing them with the original rankings. The results are displayed in Figure 1.

The results indicate that the best ranked country according to CIDI methodology is Iceland, followed by Sweden, the Netherlands, the United Kingdom and Denmark. Iceland scored 85.7 in the overall CIDI values, mainly because of its individual scores. Iceland is ranked first by the indicators *One bidder* and *Decision speed*, and second according to the highest-weighted indicator *Reporting quality*. Sweden, for example, is ranked highest according to *No calls for bids* and *Reporting quality*, but has a very low value for *Aggregation*, etc.

The results presented in this study emphasize the fact that European countries are very different in terms of public procurement efficiencies. This study is in line with other studies in confirming that Northern and Western European countries, particularly Sweden (Rank 2), hold a high rank in public procurement efficiency.³⁸ The Swedish system should be considered as a role model. Similar conclusions could be applied to the United Kingdom (Rank 4). However, the objectivity of the approach used in this study clears a path for countries such as Iceland (Rank 1) and the Netherlands (Rank 3) to be considered as paragons of public procurement efficiency. On the other side, countries that joined the EU in this century are ranked low, and none of them holds a position in the first half, excluding Malta. On many factors of this phenomenon can be speculated – from the rule of law to economic development. An interesting explanation may be that public procurement officials in postcommunist countries have 'high bargaining power' and foster informal practices.⁵² Therefore, they can raise *de jure* competitiveness in public procurements, which is highly important in the scoreboard matrix. Still, a more objective view through the CIDI approach shows real flaws in their public procurement systems.

Country	CIDI Score	CIDI Rank	Original group	
Iceland	85.70	1	above average	
Sweden	78.29	2	above average	
Netherlands	77.33	3	above average	
United Kingdom	76.60	4	above average	
Denmark	73.79	5	above average	
Norway	73.27	6	above average	
Ireland	69.54	7	above average	
France	68.16	8	average	
Belgium	66.43	9	above average	
Luxembourg	64.21	10	above average	
Austria	62.52	11	average	
Germany	60.33	12	average	
Malta	57.10	13	above average	
Finland	56.09	14	above average	
Portugal	51.22	15	average	
Spain	47.41	16	below average	
Lithuania	44.55	17	average	
Latvia	40.78	18	below average	
Estonia	39.07	19	below average	
Italy	37.73	20	below average	
Bulgaria	36.56	21	below average	
Hungary	36.48	22	below average	
Greece	35.61	23	average	
Poland	34.55	24	average	
Slovenia	33.98	25	below average	
Czech Republic	33.46	26	below average	
Romania	29.82	27	below average	
Croatia	29.36	28	below average	
Cyprus	28.09	29	below average	
Slovak Republic	26.37	30	below average	

Table 2. CIDI scores and country ranks compared with original groups.

Strengths, Limitations and Further Recommendations

The first strength of the methodology adopted in this paper is the use of a quantitative and comprehensive approach in the study of public procurement efficiency. The majority of publications in this field are either theoretical⁵³ or case-based and partial,⁵⁴ which makes comparisons and rankings rather difficult, if not impossible. However, this also creates a limitation. Being purely quantitative, the study lacks any qualitative assessments that could contribute to an in-depth understanding of the nature and causes of differences in the public procurement practices among European countries.

The second significant strength is the use of the most important variables for the assessment of public procurement efficiencies. All variables are complex and capture different aspects of the efficiency, such as competitiveness, transparency, and



Figure 1. Illustrative comparison of CIDI and original rankings.

comprehensiveness of the explored phenomena. The study uses accurate data from a reliable source. However, some critical aspects are left out of its scope. For instance, a major flaw is the exclusion of corruption from the metrics. The inclusion of corruption in public procurement measurements has been widely advocated in the literature.^{5,11,55–57} Auriol⁵⁸ defines two major types of corruptive behaviour: (1) Capture – a case of active bribery; and (2) Extortion - when a firm complies with the demand for a bribe. Although they do not affect taxpayers in the same manner, each form of corruption distorts public procurement institutions and mechanics. In the context of the EU, anti-corruption efforts are to some extent presented in the European Act on Public Procurement. Although it is not unanimously seen as the best facilitator of efficiency and a boost for competitiveness, it strives to eliminate corruptive behaviour.³⁶ This major omission is, nonetheless, difficult to capture. Chabova⁶ states that corruption is a 'clandestine activity, very often unreported, therefore there is no official statistics on the number of corruption cases'. Accordingly, inclusion of corruption in the analysis is a strong recommendation for any further research in this area.

The third and most important contribution of this paper is the use of unbiased weights and evidence-based methodologies for the assessment of public procurement efficiency among 30 European countries. Unlike other rankings,³⁸ composite indices⁵ and methodologies for improvements in public procurements,⁵⁹ which are subject to myriad different judgements and inconsistencies, this methodology clears the path for an objective and quantitative assessment of the countries' public procurement efficiency rating. Thus, the ranking resulting from this analysis could be used for an unbiased rating of public procurement systems among European countries. From the methodological point of view, further research directions of this study could address the uncertainty and sensitivity analysis of the results.^{60,61} Namely, the ranks of entities could be somewhat unstable, depending on the operating values of the weights for each of the individual indicators. Weights could be susceptible to variations

depending on their relative contributions.⁶² According to the values of the relative contributions and their standard deviations,⁶² it is manageable to perform an uncertainty and sensitivity analysis of the CIDI results, and potentially compare them with the uncertainty of the original results.

As mentioned before, the study uses reliable sources, but covers a single period of time, making the analysis cross-sectional. It is highly advisable to use time series in further studies, which would capture the evolution of public procurement systems. In addition, the study encompasses only those European countries with available data on public procurement efficiency variables. Any inclusion of new countries into the analysis would open new aspects for discussion.

Conclusions and Implications

Public procurements are high on the agenda of academics and practitioners. Regulators and other policy makers in Europe have prescribed myriad different indices and matrices for measurement, management and improvement of public procurements across the European continent. This article aims to add to this body of knowledge by creating a novel approach for the measurement and ranking of the efficiency of public procurements. For this purpose, we used a Composite I-distance Indicator methodology. Unlike any previous proposals, the presented approach ranks countries without the need for any subjective judgements. The results were tested among 30 European countries and, accordingly, the ranking displayed significant differences to conventional composite indicator-based rankings.

This article contributes to the better understanding of public procurement efficiencies as a phenomenon and puts a new spotlight on the way in which this efficiency should be measured among different countries. Therefore, the general idea of this methodology is not to replace any current scoreboards, but rather to add to the extant body of research. Using multiple matrices, policy makers will not be incentivized to advocate any single (or very few) dimensions of public procurement efficiency but will rather work on systematic solutions.

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