Have Dutch municipalities become more efficient in managing the costs of social assistance dependency?
Broersma, Lourens; Edzes, Arjen J. E.; van Dijk, Jouke

Published in:
Journal of Regional Science

DOI:
10.1111/j.1467-9787.2012.00762.x

IMPORTANT NOTE: You are advised to consult the publisher's version (publisher's PDF) if you wish to cite from it. Please check the document version below.

Document Version
Final author's version (accepted by publisher, after peer review)

Publication date:
2013

Link to publication in University of Groningen/UMCG research database

Citation for published version (APA):

Copyright
Other than for strictly personal use, it is not permitted to download or to forward/distribute the text or part of it without the consent of the author(s) and/or copyright holder(s), unless the work is under an open content license (like Creative Commons).

Take-down policy
If you believe that this document breaches copyright please contact us providing details, and we will remove access to the work immediately and investigate your claim.

Downloaded from the University of Groningen/UMCG research database (Pure): http://www.rug.nl/research/portal. For technical reasons the number of authors shown on this cover page is limited to 10 maximum.
Have Dutch Municipalities Become More Efficient in Managing the Costs of Social Assistance Dependency?

Lourens Broersma (l.broersma@rug.nl)
Arjen J.E. Edzes (a.j.e.edzes@rug.nl)
Jouke van Dijk (jouke.van.dijk@rug.nl)

Abstract

Many welfare reforms undertaken in OECD-countries are directed towards enhancing efficiency in the administration and implementation of social security. In this perspective, reforms in The Netherlands are an example of decentralization through budgeting financial means to municipalities. By using data envelopment analysis, we assess the effect of the introduction of the new Work and Social Assistance Act (WSA) in 2004 on cost efficiency. By applying a stochastic frontier analysis, we assess the impact of municipal policy strategies on cost inefficiency for the period 2005-2007. We find a clear positive effect of the WSA in 2004 on cost efficiency. Pursuing a strategy of activation raised efficiency significantly.

Keywords: social assistance, decentralization, efficiency analysis, labour market policy

JEL: H21, H30, H55, H72, J68

Acknowledgement:
Part of this research has been financed by The Netherlands Institute of City Innovation Studies (NICIS) in The Hague, The Netherlands
1. INTRODUCTION

Decentralization of national welfare policies to local government levels is one of the main movements shaping social welfare in the US and in Europe (Habibov and Fan, 2010; Eichhorst et al., 2008; Borghi and Van Berkel, 2007a, 2007b; Van Berkel, 2006; OECD, 2003, 1999). According to Eichhorst et al. (2008), who refer to this shift as ‘tools of New Welfare Governance’, it comprises processes of territorial or functional decentralization, which are quite similar across countries. In their view promoting the success of social policies, their provision and delivery has to be considered jointly with the organization and management of this process.

Decentralization is often justified by a need to improve efficiency. It prevents agency problems between national and local governments and local governments are assumed to be better able to adapt policy measures to local needs, priorities and local partnerships (Balaquer-Coll et al., 2010; OECD, 2003, 1999; Nativel et al., 2002). Kelleher and Yackee (2004) add the presumption that local officials can address problems more effectively. This paper evaluates two central claims in the decentralization debate. One claim is the overall positive impact of decentralization on the cost efficiency of local governments in public service delivery. The second claim is that local governments can indeed address and influence local problems more effectively.

The literature shows mixed results on the effects of decentralization as will be discussed in section 2. To evaluate the two central claims in the decentralization debate, we use a unique dataset covering the period 2000-2007 during which major reforms in the administration of welfare and social benefits in The Netherlands took place. The introduction of the new Work and Social Assistance Act (WSA) in 2004 decentralizes full (financial) responsibility for activating and reintegrating the 340,000 social assistance clients they had in 2004. An important aspect of the WSA-reforms is the change in funding of municipalities. Instead of claiming all social assistance expenses directly from the central government, from
2004 onwards, local governments get a fixed budget to cover all social assistance expenses. This new governance model creates incentives for reducing the number of benefit receivers since money saved by municipalities, originally earmarked for benefits, can be used for financing other expenses for local public goods. Since 2004 municipalities also have more freedom in choosing measures for activating their beneficiaries (Van Geuns and Van Gent, 2007; Tergeist and Grubb, 2006; Van Berkel, 2006).

But there is another relevant aspect in this matter. The main conclusion in a substantial and growing body of evaluation literature on active labour market policy is that there are indeed positive effects of local labour market policy instruments, but also that the net effects are in fact quite small (Card, Kluve and Weber, 2010; Kluve et al., 2007; De Koning et al., 2007; Grogger et al., 2002). Therefore, a second interesting question is if municipalities in a decentralized system are better able to prevent social assistance dependency and to promote outflow to the labour market.

The reform of the Dutch welfare system and the data set at hand gives a unique possibility to gain insight in these two fundamental questions about the effects of decentralization. The first question will be addressed for the period 2001-2007, so that an adequate assessment can be given of the WSA-reform in 2004, using Data Envelopment Analysis. The second question will be addressed for the shorter period 2005-2007, because only for this period more detailed information on municipal policy initiatives is available. We use Stochastic Frontier Analysis to assess the impact of the policy initiatives on efficiency.

In section two we describe the arguments in favor and against the expectations that decentralization lead to more efficiency. In section three we go into the specifics of Data Envelopment Analysis and Stochastic Frontier Analysis (SFA) as appropriate methods to analyze the efficiency of decentralization. Section four discusses the data used and the research design applied in this paper. In section five and six the empirical results are presented and finally section seven concludes and discusses the policy implications.
2. (IN)EFFICIENCY OF DECENTRALIZATION

There are two main arguments why decentralization should lead to more efficiency. The first reason has its origin in a rational institutionalist way of thinking, which is the basis for the new public management or neo-institutional economics (Ter Bogt, 2008; Scott, 2001; Hall & Taylor, 1996). Organizations are assumed to make rational choices between costs and revenues, are well-informed and in pursuit of efficiency. Because of information-asymmetry the national government cannot adequately control municipalities so local governments can relatively easily shift the costs of public service delivery to national governments. This dilemma could be overcome by reinforcing the financial incentives of municipalities for better implementation. In its turn, this should lead to more efficiency both at the local and at the national level. Furthermore, this could also stimulate policy innovation and policy learning, because it allows for several simultaneous experiments by local governments (Strumpf, 2002). The second reason has its origin in the contingency theory of organizations, which assumes that in becoming efficient, organizations should adapt to different environments (Donaldson, 2001). It is argued that local governments should be better equipped to adapt policy programs to local needs and circumstances, which should make social policies more flexible and more effective (Kelleher and Yackee, 2004; OECD, 2003; 1998). In situations where local policy responsibility is accompanied by financial responsibility, there is a clear incentive to perform better. Eventually this would enhance the efficiency. While both theoretical approaches lead to more efficiency, the underlying mechanisms are different.

Theoretically, it is also possible to think of a scenario in which efficiency improvements do not take place. In the neo-institutional organizational sociology, organizations do not pursue efficiency per se, simply because organizations do not always know what is effective, i.e. what is working and what is not. This certainly is true for ‘weak technology’ organizations such as schools and social welfare
organizations. In absence of knowledge and information, such organizations accept practices that have legitimacy instead of an empirically proven efficiency. That does not mean that organizations act irrationally or do not formulate goals and specify ways to reach them but ‘... these beliefs are myths in the sense that they depend for their efficacy, for their reality, on the fact that they are widely shared, or are promulgated by individuals or groups that have been granted the right to determine such matters’ (Scott & Meyer [1983], 1993: 1). In this social-constructionist point of view organizations behave according to normative and cultural guidelines. The outcome of this behavior could be that organizations converge ‘... around short-term behavioral equilibria that may be less efficient than rejected alternatives (DiMaggio, 1998: 697). Legitimacy instead of efficiency also plays a role in the political institutional point of view which introduces the concept of political conflict and path dependency. Here is organizational behavior the result of political conflict which often leads to compromises at the end. This could lead organizations to accept goals that differ from the national of efficiency one (see for instance: Bredgaard et al. 2003). Furthermore, the fact that municipalities are democratically controlled organizations, with different political assemblies and priorities could lead to outcomes that are less efficient.

The empirical literature shows mixed results on the effects of decentralization. For instance, Rodriguez-Pose and Bwire (2004) found no effect when they relate changes in levels of regional autonomy to regional differences in economic growth patterns in regions in six European countries. Otsuka et al (2010) found that the fiscal transfer of funds for regional public spending from the Japanese central government to local governments negatively affected their performance because the governmental funding reduced their motivation towards an efficient use of the taxpayer’s money in supplying public goods. Balaguer-Coll et al. (2010) found for Spain that for the municipal level there is not a clear-cut answer as to whether enhanced decentralization, or enhanced centralization, is ‘good’ or ‘bad’ in terms of cost efficiency. Their results suggest that some municipalities could manage their resources more efficiently if they were granted more power. Although these sort of decentralized economies do not emerge for all municipalities, their
magnitude clearly overshadows the diseconomies found if downscaling of decision making goes too far and least decentralized municipalities dominate.

For the US, the introduction of the US Personal Responsibility and Work Opportunities Reconciliation Act (PRWORA) in 1996 which rendered federal states more discretionary power, evoked a theoretical and empirical debate on whether the decline in social assistance dependency was caused by the unprecedented economic growth in the 1990’s or by the effects of welfare reforms and decentralization. See Danielson and Klerman (2008), Wallace (2007), Klerman and Haider (2004), Blank (2002), Bell (2002). Huffmann et al. (2007) analyzed the regional variation of the new Temporary Assistance to Needy Families (TANF) program that each state has to develop under PRWORA. They find very little evidence that household behavior with respect to TANF instruments varies across regions in the U.S. This finding may undermine the efficiency rationale for devolution of authority over welfare programs to the states. But they also find that similar instruments may lead to different outcomes across regions because demographic and initial conditions vary. Thus, to achieve similar outcomes across regions, region-specific policies may be warranted. This is also argued by Blen et al. (2010) for Germany. For Sweden, Lundin and Skedinger (2006) investigated the effects of decentralization of active labour market policies. Although they do not focus on separate policy measures, they conclude that decentralization has spurred local initiatives in the form of projects organized by municipalities and increased targeting on outsiders on the labour market.

Besides decentralization also coordination between and within governmental organizations might improve efficient decision making that is beneficial for successful policy outcomes in terms of economic performance of regions. However, the empirical literature with regard to the positive effect of coordination is scarce. Hammond and Tosun (2011) find for the US that the fragmentation of general-purpose governments per capita has a negative impact on employment and population growth in nonmetropolitan counties. Their results suggest that local government decentralization matters differently for metropolitan and nonmetropolitan counties. A study by Grassmuck and Shields (2010) for the US
shows the opposite: regions with fragmented governmental structures perform better. They do not suggest that fragmented regional government units are more efficient in producing and providing public goods, but argue that households and firms may be willing to forego additional efficiency for more localized control over public policies.

This paper evaluates two central claims in the decentralization debate. First, what have been the effects of decentralization on the municipal cost efficiency of social assistance benefits? It adds to the literature of assessing the impact of public management reform, especially at the local levels of government and public service delivery (Ter Bogt, 2008; Ridder, Bruns and Spier, 2005). Second, what is the influence of local policy strategies on this efficiency? It contributes to the literature of assessing the impact of instruments of active labour market policy (Card et al., 2010; Kluve et al., 2007).

3. FRONTIER ANALYSIS

Performances of firms or institutions are usually analyzed in terms of productive or cost efficiency. Efficiency is determined by the proximity of the actual production or costs of the firm or institution to the production or cost frontier. The absence of efficiency necessarily leads to a departure from production maximization or cost minimization and therefore creates inefficiency. In this paper, we focus on municipal cost efficiency with respect to their social assistance payments. The size of this cost inefficiency is based on the difference between observed costs and predicted minimum costs given scale, a mix of relevant outputs and factor prices as explanatory variables. In other words, each municipality in the sample is benchmarked against the ‘best’ municipality in the sample.

In the literature, frontiers have been estimated in the past using many different methods. Coelli (1996a, 1996b, 1999) clearly explains the pros and cons of the various methods like Data Envelopment Analysis (DEA) and Stochastic Frontier Analysis (SFA) that we will use in our empirical analysis. The non-parametric
approach to measuring efficiency, DEA, has the advantage of imposing less structure on the frontier than the parametric approach SFA. On the other hand, a drawback of the non-parametric DEA approach is the deterministic nature, i.e. not allowing for random errors caused by chance, data problems or other measurement errors.

In this paper, we first apply DEA to explore the changes in efficiency of municipal costs of social assistance caused by the introduction of the WSA in the Netherlands in 2004 by using data over the period 2001-2007. In the case of municipalities’ social assistance expenses, this means that the efficient municipality is not able to cut more on social assistance costs, given its demographic and socio-economic characteristics.

Next, we would like to assess the impact of municipal policy strategies on the efficiency of social assistance costs. Information about the policy strategies is only available for the shorter period 2005-2007 and can thus not be analyzed for the total period 2001-2007. DEA is a deterministic and non-parametric technique that does not allow the inclusion of policy strategies that can be related to inefficiencies. Therefore we apply SFA which is basically a parametric regression model with random errors. In a SFA these errors comprise (i) inefficiencies, following an asymmetric distribution, usually a truncated or half-normal distribution, and (ii) random errors following a symmetric distribution, usually a standard normal distribution. The reason for this particular structure of the composite error term is that inefficiencies are part of the error process and by definition cannot be negative. In order to link efficiency to municipal policy strategies, we use a single-step estimation procedure, where both SFA and strategy effects on efficiency are addressed simultaneously. This implies that policy strategies are exogenous in the model. More details on SFA are in the Appendix.
4. DATA

For the empirical analysis we have used data for all 443 municipalities in the Netherlands over the period of 2001-2007. Most data we use are drawn from Statistics Netherlands. The exact sources and definitions of the variables are documented in the Appendix. The data on expenditures on social assistance are from the Netherlands Ministry of Social Affairs.

In the frontier analysis the actual absolute municipal social assistance expenditures to pay benefits is the dependent (or output) variable. The inputs are identified as the variables that are used by the central government to determine the budgeted expenditures on social assistance for each municipality based on objective variables not at the municipal's discretion. The basic idea is that these objective variables determine to a large extent the inevitable burden of social assistance. These variables are e.g. the number of single-parent households, the share of non-Western minorities and regional job growth. The budgets are in fact very close to the actual expenditures and hence expenditures are closely related to these ‘objective’ factors that determine the budgets as well.

As mentioned in the previous section Data Envelopment Analysis (DEA) is used to gain insight in the development of overall efficiency over the whole period 2001-2007 and allows us to detect if the efficiency improved after the introduction of the WSA in 2004. As a next step, we apply Stochastic Frontier Analysis (SFA) as the appropriate method to find out if changes in efficiency are related to the use of particular policy strategies by municipalities to limit social assistance dependency (Broersma et al. 2011; Edzes 2010). Information on the policy strategies is available only for the period 2005-2007. We will now elaborate on this issue. Each of these strategies can be identified by a number of indicators. Table 1 shows which indicators are used to reflect each strategy (Edzes, 2010).

A straightforward indicator for the control strategy is the share of detected fraud cases. We assume that the detected fraud case is a valid and reliable indicator for
actual efforts from municipalities to combat fraud behavior. An analysis of differences between municipalities shows that substantial differences between municipalities in detected fraud cases occur when we look at region, scale and urbanization suggesting different efforts from municipalities (Edzes, 2010). The control strategy might also check whether social assistance benefit recipients are eligible for other social security arrangements that are not paid from the budget of the municipality. A successful strategy will raise the influx in such measures as disability for those without work experience (Wajong) or as social work provision (WSW) and therefore the influx in these type of social benefits will be above average in that municipality.

An activation strategy comprises subsidized employment, where social assistance benefit recipients obtain a sheltered job for which the wage costs are covered by a subsidy instead of from the income part of social-assistance budget. Activation may also take the form of providing courses that enhance the skills for a job or job search, such as application courses. Municipalities are free in the design as well as the number of courses they provide. Although the budget municipalities receive for activation strategies is fixed and determined by the number of recipients of social assistance corrected by the local labour market situation, municipalities differ substantially in the number and type of courses provided as well as the share of the activation budget they spend on courses (Edzes, 2010).

The employment strategy is reflected by the growth rate of the number of establishments, indicating successful municipal efforts to create favorable business conditions, and by the municipal expenses on economic affairs. Finally, the coordination strategy is reflected by the extent to which municipal social services, who carry out social assistance, work together in so called Inter Municipality Services (IMS).

-- Table 1 somewhere here --
As a next step we determine for each municipality whether it lies above or below the national average of each of the indicators.\textsuperscript{vi} If a municipality has a score above the national average on one indicator, reflecting a particular strategy, a dummy for such a municipality will be labeled 1, indicating it as user of this strategy. Based on the number of strategies a municipality uses, it will be allocated to one of the 16 single or multiple policy strategy categories in Table 2. Note that the 16 categories are mutually exclusive, i.e. each municipality enters in one and only one strategy option.

\begin{table}[h]
\centering
\begin{tabular}{|c|c|}
\hline
Strategy & Number of Municipalities \\
\hline
None & 711 \\
One & 343 \\
Two & 122 \\
Three & 33 \\
\hline
\end{tabular}
\caption{Policy Strategy Usage Over 2005-2008}
\end{table}

Table 2 shows the distribution over the 16 policy categories. The number of strategies by municipalities, for the period 2005-2008, adds up to a total of 1329, i.e. for each of the three years, all 443 municipalities are covered. Note that most municipalities have no focus on any of the strategies, i.e. their value on each indicator for the policy strategies is below average and this leads to the classification that 711 municipalities between 2005-2008 are in the strategy category 'None'. Note also that only a few municipalities focus on three strategies simultaneously, while there is no municipality focusing on all four options. Since particularly the option of using three strategies is not very popular among municipalities, we have also estimated the model with a variable indicating the number of strategies used (none, one, two or three) irrespective of the type of strategy.

5. EMPIRICAL RESULTS

In this section the empirical results are presented with regard to the efficiency measures obtained by applying the DEA and SFA approach. First we applied DEA
using the computer program of Coelli (1996a). DEA is a deterministic and non-parametric analytical approach in which linear programming determines the efficiency. The output variable comprises the municipal social assistance expenditures, which will be related to eight inputs, viz. the demographic and socio-economic variables that determine the municipal social assistance budget: (i) household with a low income, (ii) single parent households, (iii) non-Western minorities, (iv) inhabitants with an unemployment insurance benefit, (v) inhabitants with a low education, (vi) vacancy-unemployment ratio of the COROP-region (NUTS-3 region) in which the municipality is located, (vii) number of municipal jobs and (viii) address density, as urbanization measure.

Figure 1 gives the average annual efficiency of municipal social assistance expenses between 2001 and 2007, based on the above DEA model. First of all we can conclude that the overall level of efficiency is high (above 90 percent) in all years. Clearly the pattern of the efficiency over time shows a break in 2004. We conducted a sensitivity analysis by varying the inputs. Apart from minor changes in the average efficiency level, the pattern over time, including the clear break in 2004, remained the same. This provides evidence in favor of the premise that introduction of the decentralization of the WSA to municipalities has raised efficiency. Efficiency rose from 91 percent in the period 2001-2003 to 95 percent in the period 2004-2007, a 4 percent points increase between 2003 and 2004. Note the downward trend in efficiency after 2005. The explanation for his negative trend will be discussed in the sequel.

The next step is that we relate the variation in efficiency among municipalities to the policy strategies they use in an SFA-model. Because data for the policy strategies are not available for all years, this analysis is only possible for the period 2005-2007. The cost frontier model comprises a cost model, relating
municipal social assistance costs \((SAC)\) to a number of explanatory variables and an inefficiency model relating inefficiency \((u)\) to municipal strategy variables \((D-policy-strat)\). The SFA model is specified as

\[
\log(SAC_{i,t}) = \beta_0 + \beta_1 \log(HH_{low-inc,t}) + \beta_2 \log(HH_{single-par,t}) + \beta_3 \log(POP_{minor,t}) + \\
+ \beta_4 \log(POP_{unem-insur,t}) + \beta_5 \log(POP_{low-edu,t}) + \beta_6 \log(V/U)_{i,t} + \\
+ \beta_7 \log(A/S)_{i,t} + \beta_8 \log(Jobs_{empl,t}) + \sum_{i=0}^{19} \beta_i D_{region,i} + \sum_{i=20}^{23} \beta_i D_{size,i} + v_{i,t} + u_{i,t}
\]

(1)

and

\[
u_{i,t} = \delta_0 + \sum_{j=1}^{N} \delta_j D_{policy-strat,j} + \varepsilon_{i,t}
\]

(2)

where \(SAC_{i,t}\) are the social assistance expenses of municipality \(i\) in period \(t\). The \(\beta_0\) represents period fixed effects, the other \(\beta\)'s are parameters.\(^{viii}\) \(HH\)-variables represent the number of households with specific characteristics (low income or single parent), \(POP\) refers to the number of inhabitants with certain characteristics (non-Western minority, having an unemployment insurance benefit or low education). \(V/U\) is the vacancy-unemployment ratio of the COROP region (NUTS3-level) in which the municipality is located and acts as an approximation of municipal labour market tightness, \(A/S\) is the number of addresses \((A)\) per km\(^2\) municipal surface \((S)\), which acts as a measure of urbanization. \(Jobs\) represents the number of jobs located within a municipality and finally the \(D\)-variables refer to dummy variables reflecting municipal characteristics, viz. the part of the country NUTS1-region where the municipality is located and the size class it belongs to.\(^{ix}\) Finally, the error terms in (1) comprises \(v_{i,t}+u_{i,t}\). The \(v_{i,t}\)'s are iid random variables following a \(N(0,\sigma^2_v)\) distribution and the \(u_{i,t}>0\) are iid distributed \(N(\mu_{i,t},\sigma^2_u)\). The \(u_{i,t}\)'s represent the inefficiency parameter, related to the municipal policy strategies \(D_{policy-start,i,t}\) described in table 2.\(^{x}\)
The estimation results of the SFA model are reported in Table 3. The first model includes all possible options and combinations of policy strategies and also includes period fixed effects. The results for model (1) in the first column of table 3 show that period fixed effects are not significantly different from zero, so they can validly be omitted from the model of column one, which gives the results represented in the second column. In the models of columns 3 and 4, we experiment with grouping municipalities that combine two or three policy strategies, because some combinations of specific policy strategies are only used by a very limited number of municipalities.

For these four model specifications, we find that all explanatory variables in the cost model part of (1) are highly significant and have the expected sign. The variables in the cost model explain a lot of the variation in social assistance costs. A simple OLS regression of these variables without the policy variables shows an $R^2$ of 0.96.

Next we turn to the results of the inefficiency part of the model in the lower panel of Table 3. Please note that a negative coefficient implies that the particular policy measure improved the efficiency, whereas a positive coefficient points towards lower efficiency. The results for the model of the second column of table 3 show that most policy variables are not significant and that some of the variables that are significant show an unexpected sign. An improvement in efficiency is exerted by a policy strategy of activating social assistance recipients. The control strategy and some combinations of control and job creation have a worsening effect on efficiency, and this also occurs for a focus on the combination of the three strategies of control, activation and coordination. When we group all municipalities that employ two or three strategies in the model of the third column, the combination of two strategies still lowers efficiency. The estimation results in the fourth column show that when all municipalities that employ more than one strategy are taken together in one variable, the result still is that a focus on multiple strategies lowers efficiency.
Figure 2 shows the average municipal efficiency score for the years 2005-2007, based on the SFA estimations in the final column of table 5. The efficiency pattern we found with the SFA-model is very similar to the efficiency pattern we found with DEA-approach for the same period 2005-2007, i.e. a downward trend after 2004 and a high overall efficiency of roughly 95 percent.

6. DEVELOPMENTS IN COST EFFICIENCY

Based on the finally selected model in the fourth column of Table 3, the result of Table 4 provide additional information on the mean level and the variation over municipalities of the various policy strategies we have distinguished.

It is clear that only strategies of activation (A) and employment (E) show a higher average mean efficiency than the baseline strategy, i.e. without focus on a particular strategy, while the control and coordination strategy and combinations of strategies lead to lower efficiency levels.

A possible explanation for the negative effect of control as strategy might be that 2005-2007 was a period of strong job growth following the 2002-2003 recession.
In these circumstances with a lot of open vacancies, many social assistance recipients move relatively easily into employment. Control is now likely not as effective as in less favorable periods when recipients put less effort in job search with the argument that no jobs are available.

A plausible reason for the strong positive impact of activation as policy strategy is the fact that the employment inflow of social assistance recipients in regular jobs is more successful in this period of many job openings. In addition to that, activation might be successful because it is strongly linked to subsidized employment programs. For municipalities it is profitable if the activation strategy causes that a person no longer receives a social assistance benefit from the income-part of the budget, but instead gets a sheltered job of which the wage is paid from the work-part of the budget. So, from the perspective of social assistance expenditures, an outflow into regular or subsidized jobs increases efficiency. From the perspective of overall active labour market costs at the national level, the costs of subsidized employment are a mere substitute of social assistance costs. Only when subsidized employment is temporary and helps to get a regular jobs after some time, it contributes to the efficiency of social assistance expenditures.

Our results do not imply that for any further increase in efficiency, municipalities should pursue a strategy of activation. In the period 2005-2007, this might have raised cost efficiency, but in other periods other strategies, or combinations thereof, might be more useful. The downward trend in efficiency for 2005-2007 in Figure 1 and 2 may be due to changes in the economic situation. Immediately after the 2002-2003 recession, it is relatively easy to activate the best skilled benefit recipients. After a few years, it will be harder to activate those with lesser skill levels to employment. This causes the slight downward trend in efficiency for the period 2005-2007.

As a final step in the interpretation of the results we will analyse the distribution of the efficiency scores over the municipalities in more detail. Figure 3 compares the
efficiency scores based on the DEA-approach for 2001, 2004 and 2007. This figure shows that the share of municipalities operating on the cost frontier (efficiency score = 1) is fairly constant over time around 30 percent. Moreover, these appear to be largely the same municipalities over time. The municipal efficiency scores obtained with the SFA-approach for 2005-2007 are in Figure 4. This figure shows interesting differences in the development of efficiency for the lower and higher end of the distribution of efficiency. Comparing 2005 with 2006 and particularly 2007, shows that efficiency at the lower end of the distribution deteriorated. At the same time, comparing the same years at the higher end of the distribution yields exactly the opposite. Now, efficiency in both 2006 and 2007 improved compared to 2005. However, the overall deterioration of efficiency at the lower end outweighed the improvement and the higher end and this leads to the slightly lowering efficiency over time that was already shown in Figure 1. It is also clear that, overall, efficiency levels are highest around 2004 and 2005, but slightly fall thereafter, as confirmed in Figures 1 and 2.

-- Figures 3 and 4 somewhere here --

The patterns of the annual efficiency scores of these figures imply that these scores change over time and partly depend on municipal policy strategies. What has happened between 2005 and 2007 is that many municipalities abandoned the option for not pursuing a particular strategy. The number of municipalities with no particular strategy dropped from 272 in 2005 to 199 in 2007. The number of municipalities with a control strategy rose from 23 in 2005 to 30 in 2007. Something similar happened with combinations of strategies, rising between 2005 and 2007 from 24 to 88 municipalities. This led to the deterioration at the lower end of the distribution in those years. At the same time the number of municipalities adopting an activation strategy doubled from 27 in 2005 to 54 in 2007. This improved the higher end of the efficiency distribution.
7. CONCLUSIONS

The past 15 years Dutch reforms in the legislation and administration of welfare and social assistance benefits shifted competence and financial responsibility from the national government to the local level of municipalities. As far as social assistance is concerned, these reforms culminated in the Work and Social Assistance Act (WSA) in 2004. Although municipalities do not have the authority to change the actual benefit level, they can develop their own local or regional policies, like cooperation, preventing unemployment, reintegration measures, gatekeeper-roles and so on. The gradual budgeting of the financial means for social assistance from 2001 to 2004, culminating in budgeting 100 percent of the costs of social assistance and reintegration to municipalities should give them enough incentives to act efficiently. So, the research question is whether Dutch municipalities have become more efficient in managing the costs of social assistance dependency.

Three conclusions can be drawn from our analysis. First the overall level of efficiency has improved. DEA shows a clear break in cost efficiency in 2004. Hence the WSA did improve municipal cost efficiency of social assistance. After 2004 the improvement slowly seems to leak away. The outcome of the DEA was very robust for other inputs used in the analysis.

Second, SFA shows that municipal policy strategies do matter in improving cost efficiency of social assistance. We found that in the period 2005-2007 particularly a strategy of activating social assistance benefit recipients improved efficiency. Other strategies notably control and combinations of different strategies have had a lowering effect on cost efficiency. The changes in the distribution of efficiency in the period 2005-2007 can be explained by the changing policy mix that municipalities pursue during that period.

Third the fact that some policy strategies contribute to increasing cost efficiency while others do not, is related to economic and regional circumstances. In periods
of strong job growth with a lot of open vacancies, many social assistance recipients move relatively easy into employment. In these circumstances control is not as effective as in less favorable periods when recipients put less effort in job search with the argument that no jobs are available. Activation on the other hand seems to give the right push to enter the labour market.

To conclude, the overall efficiency is already very high in The Netherlands with a value around 95 percent. Hence, there is influence of municipal policy, as we have seen, but this effect is small. After all, about 95 percent of the social assistance expenditures in the period 2005-2007 are determined by the inputs, i.e., factors that are not directly at the municipality’s discretion. This confirms our research of the total policy effects on the in- and outflow of social assistance (Broersma et al, 2011). Because of that, the margins at which efficiency improvement could take place are very small.

**NOTES**

---

i Over time the number of municipalities has decreased due to mergers of small municipalities. To solve this problem municipalities were regrouped into the 443 municipalities of 2007.

ii For the period of 2004-2007 all expenditures are available at municipal level. For 2001-2003 municipalities working together in a joint social service with others (i.e. an Inter-Municipal Social Service, IMS) only information is available at that IMS-level. In those cases we have redistributed the information at municipal levels based on each municipal share of households in the total of the IMS.

iii After 2004, municipal social assistance budgets comprise two parts: (i) an income part providing income support for the social assistance recipient and (ii) a work part providing (re-)integration (i.e. activation) support in order to stimulate acquiring skills and/or job search in order to increase the chance to (re-)enter the labour market. Before 2004 this distinction was not made and there was only one budget, corresponding to the income part. The dependent variable in our analysis refers only to the expenditures of the income part, because only for this part the municipality bears the financial risk. This is not the case with
the work part. Municipalities are stimulated to spend this money, because otherwise the money has to be paid back to the central government.

This so-called objective distribution -model (‘objectieve verdeelmodel’) is gradually implemented and first been applied to the municipalities with over 60.000 inhabitants: in 2004 the total amount of budget that was objectively divided lies at 40 percent, in 2006 the full budget was objectively divided. For the smaller municipalities (in 2004: less than 40.000 inhabitants and from 2006 less than 30.000 inhabitants) the budgets were based on a a so-called historical division model (‘historisch verdeelmodel’). For the in between group (40.000-60.000 inhabitants) a mixture is chosen between an objective and a historical dividing model.

This subsidy stems from the work part of the municipal social assistance budgets.

Of course this implies that each indicator is scaled to make it comparable across municipalities. Wajong- and WSW-inflow are scaled with the total municipal population between 15-64 years of age. Fraud cases are related to social assistance recipients. Subsidised employment and other, non-subsidised, activation courses are also scaled with the social assistance recipients. Annual growth of establishment is in percentages and Economic Affairs outlays are relative to the entire population. IMS is already a dummy variable.

We apply the Malmqvist index to account for the possible changes in the frontier itself as a result of the reform.

The model specification in (1) represents the variables of the simplified model. We adopt a modelling strategy of moving from general to specific. The general models contains additional variables that could validly be deleted from our model. The estimation results of this general model are available upon request. Cross-section (i.e. municipal) fixed effects were not considered because than we lose too many degrees of freedom. Instead we include some characteristics of the municipalities like the part of the country (Nuts 1 region) where it is located and the size class of the municipality.

Four size classes are distinguished: (i) more than 100.000 inhabitants, (ii) 50.000-100.000 inhabitants, (iii) 20.000-50.000 inhabitants and (iv) less than 20.000 inhabitants.

We do acknowledge the fact that endogeneity between municipal policy strategies and social assistance expenses is important. However, we feel this is less of an issue here for number of reasons. First, in essence a municipality is free to determine what policy strategy it wishes to follow. Of course this may be influenced by the local circumstances or the
budgets they receive and these may be determined by local circumstances. Nevertheless, it remains at the municipality council’s discretion what policy strategies it will use and the political preferences may differ for municipalities with comparable local labour markets.

Second, the statistical method used, in this case the SFA, is already a two-step approach where first the total variation in social assistance expenditures is explained by conditional and exogenous factors. On top of that, the remaining variance is explained by introducing the policy strategies. Third, the strategies are measured not by using the actual share of the underlying indicators, but by determination of whether a municipality lies above or below the national average of each of these indicators.

Including municipal fixed effect dummies would boil down to adding 443 dummy variables to the model which implies a degrees of freedom problem. Instead we have added regional dummies and municipality size class dummies to pick up possible municipality fixed effects.

Our model specification is drawn from Battese and Coelli (1995). In general terms, this may be expressed as $y_{i,t} = x_{i,t}\beta + (v_{i,t}+u_{i,t})$, where $y_{i,t}$ is the production of the $i$-th municipality in year $t$, $x_{i,t}$ represents the vector of input quantities of municipality $i$ and $\beta$ is vector of unknown parameters. The $v_{i,t}$'s are random variables, that are iid, following a $N(0,\sigma^2_v)$ distribution and they are independent of $u_{i,t}$, which are non-negative random variables, which are assumed to account for technical inefficiency in production and are assumed to be independently estimated as truncations at zero of the $N(m_{i,t},\sigma^2_u)$, where $m_{i,t}=z_{i,t}\delta$, where $z_{i,t}$ is a vector of variables that affects the efficiency of the municipal strategies and $\delta$ is a vector of parameters. The parameterisation of Battese and Corra (1977) is used to replace $\sigma^2_u$ and $\sigma^2_v$ by $\sigma^2=\sigma^2_u+\sigma^2_v$ and $\gamma=\sigma^2/(\sigma^2_u+\sigma^2_v)$. The estimated values of $\sigma^2$ and $\gamma$ are also reported in table 3. The significance of any form of a stochastic frontier can be tested by the significance of the parameter $\gamma$. If the null hypothesis that $\gamma$ equals zero cannot be rejected, this would indicate that $\sigma^2_u=0$ and so $u_{i,t}$ can be removed from the model, which indicates that the model can then be estimated with simple OLS.
REFERENCES


Tergeist, Peter and David Grubb. 2006. Activation strategies and the performance of employment services in Germany, the Netherlands and the United Kingdom. Paris: OECD.


## Data appendix – Model variables

<table>
<thead>
<tr>
<th>Name</th>
<th>Short description</th>
<th>Source</th>
</tr>
</thead>
<tbody>
<tr>
<td>Expenditures social assistance 2004-2007</td>
<td>Total of expenditures on social assistance to persons PER CAPITA? &lt; 65 years of age. all municipalities</td>
<td>Ministry of Social Affairs</td>
</tr>
<tr>
<td>Expenditures social assistance 2001-2003</td>
<td>Total of expenditures on social assistance to persons &lt; 65 years of age. all municipalities</td>
<td>Ministry of Social Affairs</td>
</tr>
<tr>
<td>Single-parent households</td>
<td>Share of single parent households in total number of households</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Minorities</td>
<td>Share of minorities of non-Western descent in total population</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Low incomes</td>
<td>Share of households with income at the lowest 4 deciles of the national income distribution</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>House value</td>
<td>Total house value as share of total housing stock</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Low educated</td>
<td>Share population between 15-64 with a low education (at most ISCED 3)</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Unemployment insurance</td>
<td>Share of persons between 15-64 with a UI benefit</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>VU-ratio</td>
<td>Ratio of vacancies and unemployed labour force in the corop-region (NUTS3) the municipality is in</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Employment function</td>
<td>Ratio of jobs and the population between 15-64</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Address density</td>
<td>Number of addresses per km$^2$</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Fraud cases</td>
<td>Share of fraud cases in average number of persons on social assistance</td>
<td>Divosa and Statistics Netherlands</td>
</tr>
<tr>
<td>Inflow Wajong</td>
<td>Ratio of inflow in Wajong arrangement and population between 15-64 (at start of period)</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Inflow WSW</td>
<td>Ratio of inflow in WSW and population between 15-64 (at start of period)</td>
<td>Ministry of Social Affairs and Statistics Netherlands</td>
</tr>
<tr>
<td>Reintegration courses</td>
<td>Ratio of reintegration courses and population between 15-64</td>
<td>Statistics Netherlands</td>
</tr>
<tr>
<td>Subsidised reintegration courses</td>
<td>Ratio of subsidised reintegration courses and population between 15-64</td>
<td>Statistics Netherlands</td>
</tr>
</tbody>
</table>
Figures and tables

**FIGURE 1:** Average municipal efficiency of social assistance expenses in The Netherlands, 2001-2007 (DEA)

![Graph showing average municipal efficiency of social assistance expenses in The Netherlands, 2001-2007 (DEA).](image)

**FIGURE 2:** Average municipal efficiency of social assistance expenses in The Netherlands, 2005-2007 (SFA)

![Graph showing average municipal efficiency of social assistance expenses in The Netherlands, 2005-2007 (SFA).](image)
FIGURE 3: Distributions of municipal efficiency (Y-axis) for 2001, 2004 and 2007 from DEA (X-axis: percent of municipalities)

FIGURE 4: Distributions of municipal efficiency (Y-axis) for 2005-2007, from SFA (X-axis: percent of municipalities)
TABLE 1: Four municipal policy strategies with respect to social Assistance, 2005-2007

<table>
<thead>
<tr>
<th>Municipal strategy</th>
<th>Short description</th>
<th>Indicators</th>
</tr>
</thead>
</table>
| Control (C1)       | Threat; emphasis on fraud detection and research whether recipients are not eligible for other social arrangements | - Wajong-inflow*  
                          - WSW-inflow**  
                          - Fraud cases |
| Activate (A)       | Emphasis on participation by entering into subsidized jobs or other courses | - Subsidized employment  
                          - Non-subsidised courses |
| Employment (E)     | Emphasis on job creation by stimulus of new firms or by high municipal economic affairs outlays | - Growth rate of establishments  
                          - Expenditures on economic affairs |
| Coordination (C2)  | Municipalities that have a joint social service with other municipalities | |

* Wajong refers to the disability arrangement for young persons with no employment history  
** WSW refers to employment through social work provisions for disabled persons  
*** IMS stands for Inter-Municipal Social service and is a dummy variable of 1 when a municipality joins such an IMS

TABLE 2: Options of policy strategies and combinations

<table>
<thead>
<tr>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>None</td>
<td>711</td>
<td>10</td>
<td>A+C2</td>
<td>38</td>
</tr>
<tr>
<td>2</td>
<td>Control (C1)</td>
<td>69</td>
<td>11</td>
<td>E+C2</td>
<td>17</td>
</tr>
<tr>
<td>3</td>
<td>Activate (A)</td>
<td>119</td>
<td>12</td>
<td>C1+A+E</td>
<td>7</td>
</tr>
<tr>
<td>4</td>
<td>Employment (E)</td>
<td>69</td>
<td>13</td>
<td>C1+A+C2</td>
<td>9</td>
</tr>
<tr>
<td>5</td>
<td>Coordination (C2)</td>
<td>201</td>
<td>14</td>
<td>C1+E+C2</td>
<td>2</td>
</tr>
<tr>
<td>6</td>
<td>C1+A</td>
<td>28</td>
<td>15</td>
<td>A+E+C2</td>
<td>5</td>
</tr>
<tr>
<td>7</td>
<td>C1+E</td>
<td>22</td>
<td>16</td>
<td>C1+A+E+C2</td>
<td>0</td>
</tr>
<tr>
<td>8</td>
<td>C1+C2</td>
<td>16</td>
<td>17</td>
<td>All 2 combinations</td>
<td>137</td>
</tr>
<tr>
<td>9</td>
<td>A+E</td>
<td>19</td>
<td>18</td>
<td>All 3 combinations</td>
<td>23</td>
</tr>
</tbody>
</table>
TABLE 3: Estimation results of social assistance cost frontier model, 2005-2007

<table>
<thead>
<tr>
<th>Cost model</th>
<th>(1)</th>
<th>(2)</th>
<th>(3)</th>
<th>(4)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Including period fixed effects</td>
<td>Yes</td>
<td>No</td>
<td>No</td>
<td>No</td>
</tr>
<tr>
<td>Ln (HH_low income)</td>
<td>0.713***</td>
<td>0.721***</td>
<td>0.723***</td>
<td>0.723***</td>
</tr>
<tr>
<td>Ln (HH_single parent)</td>
<td>0.590***</td>
<td>0.607***</td>
<td>0.605***</td>
<td>0.605***</td>
</tr>
<tr>
<td>Ln (POP_minority)</td>
<td>0.154***</td>
<td>0.152***</td>
<td>0.152***</td>
<td>0.153***</td>
</tr>
<tr>
<td>Ln (POP_unempl. insurance)</td>
<td>0.189***</td>
<td>0.174***</td>
<td>0.173***</td>
<td>0.172***</td>
</tr>
<tr>
<td>Ln (POP_low edu.)</td>
<td>-0.120***</td>
<td>-0.123***</td>
<td>-0.128***</td>
<td>-0.127***</td>
</tr>
<tr>
<td>Ln (Vacancy/Unemployment)</td>
<td>-0.192***</td>
<td>-0.170***</td>
<td>-0.172***</td>
<td>-0.171***</td>
</tr>
<tr>
<td>Ln (Jobs)</td>
<td>-0.223***</td>
<td>-0.227***</td>
<td>-0.223***</td>
<td>-0.223***</td>
</tr>
<tr>
<td>Ln (Addresses/km²)</td>
<td>0.110***</td>
<td>0.109***</td>
<td>0.109***</td>
<td>0.108***</td>
</tr>
<tr>
<td>NORTH</td>
<td>0.177***</td>
<td>0.187***</td>
<td>0.185***</td>
<td>0.187***</td>
</tr>
<tr>
<td>WEST</td>
<td>0.163***</td>
<td>-0.168***</td>
<td>-0.175***</td>
<td>-0.175***</td>
</tr>
<tr>
<td>SIZE &gt;100k</td>
<td>-0.376***</td>
<td>-0.382***</td>
<td>-0.370***</td>
<td>-0.370***</td>
</tr>
<tr>
<td>SIZE 50-100k</td>
<td>-0.190***</td>
<td>-0.191***</td>
<td>-0.181***</td>
<td>-0.184***</td>
</tr>
<tr>
<td>SIZE 20-50k</td>
<td>-0.211***</td>
<td>-0.211***</td>
<td>-0.207***</td>
<td>-0.207***</td>
</tr>
<tr>
<td>Fixed effects:</td>
<td>Dummy 2006</td>
<td>0.029</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Dummy 2007</td>
<td>0.035</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Inefficiency model</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>No specific strategy</td>
<td>0.010</td>
<td>0.001</td>
<td>0.021</td>
<td>0.022</td>
</tr>
<tr>
<td>C1</td>
<td>0.104*</td>
<td>0.110**</td>
<td>0.094*</td>
<td>0.094*</td>
</tr>
<tr>
<td>A</td>
<td>-0.212'</td>
<td>-0.274***</td>
<td>-0.298***</td>
<td>-0.316***</td>
</tr>
<tr>
<td>E</td>
<td>-0.072</td>
<td>0.022</td>
<td>-0.038</td>
<td>-0.029</td>
</tr>
<tr>
<td>C2</td>
<td>0.032</td>
<td>0.029</td>
<td>0.028</td>
<td>0.026</td>
</tr>
<tr>
<td>C1+A</td>
<td>0.110</td>
<td>0.122*</td>
<td></td>
<td></td>
</tr>
<tr>
<td>C1+E</td>
<td>0.169**</td>
<td>0.180**</td>
<td></td>
<td></td>
</tr>
<tr>
<td>C1+C2</td>
<td>0.093</td>
<td>0.113</td>
<td></td>
<td></td>
</tr>
<tr>
<td>A+E</td>
<td>0.037</td>
<td>0.050</td>
<td></td>
<td></td>
</tr>
<tr>
<td>A+C2</td>
<td>-0.067</td>
<td>0.018</td>
<td></td>
<td></td>
</tr>
<tr>
<td>E+C2</td>
<td>-0.258</td>
<td>-0.089</td>
<td></td>
<td></td>
</tr>
<tr>
<td>C1+A+E</td>
<td>0.117</td>
<td>0.133</td>
<td></td>
<td></td>
</tr>
<tr>
<td>C1+A+C2</td>
<td>0.219**</td>
<td>0.238**</td>
<td></td>
<td></td>
</tr>
<tr>
<td>C1+E+C2</td>
<td>0.146</td>
<td>0.174</td>
<td></td>
<td></td>
</tr>
<tr>
<td>A+E+C2</td>
<td>0.109</td>
<td>0.120</td>
<td></td>
<td></td>
</tr>
<tr>
<td>All combinations of 2 strategies</td>
<td></td>
<td></td>
<td>0.153**</td>
<td></td>
</tr>
<tr>
<td>All combinations of 3 strategies</td>
<td></td>
<td></td>
<td>0.060</td>
<td></td>
</tr>
<tr>
<td>All possible combinations</td>
<td></td>
<td></td>
<td>0.073*</td>
<td></td>
</tr>
<tr>
<td>σ²</td>
<td>0.057***</td>
<td>0.056***</td>
<td>0.057***</td>
<td>0.057***</td>
</tr>
<tr>
<td>γ</td>
<td>0.028</td>
<td>0.020***</td>
<td>0.020***</td>
<td>0.023***</td>
</tr>
<tr>
<td>Log-likelihood</td>
<td>294.7</td>
<td>551.1</td>
<td>44.44</td>
<td>42.53</td>
</tr>
<tr>
<td>Number of observations</td>
<td>1329</td>
<td>1329</td>
<td>1329</td>
<td>1329</td>
</tr>
<tr>
<td>Number of cross-sections</td>
<td>443</td>
<td>443</td>
<td>443</td>
<td>443</td>
</tr>
<tr>
<td>Number of time periods</td>
<td>3</td>
<td>3</td>
<td>3</td>
<td>3</td>
</tr>
</tbody>
</table>

Seven large outlying values have been removed from the sample.

* significance at 10 percent
** significance at 5 percent
*** significance at 1 percent

29
### TABLE 4: Efficiency scores by type of policy strategy, 2005-2007

<table>
<thead>
<tr>
<th>Strategy</th>
<th>mean</th>
<th>s.d.</th>
<th>Max - min</th>
<th>Strategy</th>
<th>mean</th>
<th>s.d.</th>
<th>Max - min</th>
</tr>
</thead>
<tbody>
<tr>
<td>None</td>
<td>0.963</td>
<td>0.003</td>
<td>0.970-0.956</td>
<td>A+C2</td>
<td>0.915</td>
<td>0.005</td>
<td>0.924-0.903</td>
</tr>
<tr>
<td>Control (C1)</td>
<td>0.877</td>
<td>0.005</td>
<td>0.896-0.869</td>
<td>E+C2</td>
<td>0.916</td>
<td>0.006</td>
<td>0.925-0.902</td>
</tr>
<tr>
<td>Activate (A)</td>
<td>0.997</td>
<td>0.002</td>
<td>1.000-0.996</td>
<td>C1+A+E</td>
<td>0.811</td>
<td>0.005</td>
<td>0.815-0.803</td>
</tr>
<tr>
<td>Employment (E)</td>
<td>0.978</td>
<td>0.001</td>
<td>0.981-0.976</td>
<td>C1+A+C2</td>
<td>0.808</td>
<td>0.004</td>
<td>0.815-0.803</td>
</tr>
<tr>
<td>Coordination (C2)</td>
<td>0.944</td>
<td>0.004</td>
<td>0.957-0.930</td>
<td>C1+E+C2</td>
<td>0.810</td>
<td>0.007</td>
<td>0.815-0.805</td>
</tr>
<tr>
<td>C1+A</td>
<td>0.913</td>
<td>0.004</td>
<td>0.921-0.904</td>
<td>A+E+C2</td>
<td>0.811</td>
<td>0.005</td>
<td>0.817-0.804</td>
</tr>
<tr>
<td>C1+E</td>
<td>0.912</td>
<td>0.004</td>
<td>0.918-0.905</td>
<td>All 2 combinations</td>
<td>0.914</td>
<td>0.005</td>
<td>0.925-0.902</td>
</tr>
<tr>
<td>C1+C2</td>
<td>0.913</td>
<td>0.004</td>
<td>0.919-0.906</td>
<td>All 3 combinations</td>
<td>0.810</td>
<td>0.005</td>
<td>0.817-0.803</td>
</tr>
<tr>
<td>A+E</td>
<td>0.915</td>
<td>0.004</td>
<td>0.923-0.907</td>
<td>All combinations</td>
<td>0.899</td>
<td>0.037</td>
<td>0.925-0.803</td>
</tr>
</tbody>
</table>

Note: s.d. stands for standard deviation, as a measure of spread of efficiency, the range provides the maximum and minimum efficiencies, i.e. municipalities with highest and lowest efficiency value.