

Case Report

# Data visualization of European regional operational programmes: unleashing the informative potential of open data for performance assessment

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**Abstract:** The implementation of the European Cohesion Policy aiming at fostering regions competitiveness, economic growth and creation of new jobs is documented over the period 2014-2020 in the publicly available Open Data Portal for the European Structural and Investment funds. On the base of this source, this paper aims at describing the process of data mining and visualization for information production on regional programmes performance in achieving effective expenditure of resources.

**Keywords:** cohesion policy; data visualization; open data.

## 1. Introduction

The EU Cohesion Policy is one of the western world's largest local and regional development policy operating under broadly one overall legal and institutional framework. It targets all regions and cities in the European Union and is aimed at fostering regions competitiveness, economic growth and creation of new jobs. The planned resources over the period 2014-2020 by different funds are more than EUR 350 billion, almost one third of the total budget of the Union.

Each European region can access the planned financing in the different funds according to specific investment strategies defined within their Operational Programmes (OP). These documents have a predefined structure for the selection and categorisation of the investment decisions and their reporting each year. In particular, projects selected, expenditure, output and result indicators have to be monitored by the Managing Authorities (MAs) responsible for the management of funds and shall be reported in the framework of the Annual Implementation Report (AIR).

In the last years the political context and the financial and economic pressure on countries budgets have imposed a change in terms of accountability and justification of public expenditure, a stronger need to inform taxpayers on public investments and to broaden the debate on cohesion policy and its future orientation.

At the same time, compared to the previous programming period 2007-2013, the information management capacity and availability of quality data have largely improved with the development of many agile solutions for data usability.

Furthermore, the current legislative framework has a stronger focus on result-orientation on the performance of regions in achieving investment objectives defined during the programme design phase in terms of development needs and benefits for citizens.

30 For these reasons, the reported data on financing and achievements under all the ESI Funds 2014-2020  
31 are available under the criteria of transparency and accountability at the Open Data Portal for the  
32 ESIF<sup>1</sup>. The intended users of these data is anyone interested in monitoring the development of the  
33 policy and in particular citizens of the Union, Member State administrations, EU Institutions, policy  
34 makers, researchers and practitioners in regional development studies. However, the indicators and  
35 visualizations currently provided allows only for a broaden and general view of the policy evolution  
36 and the structure, size and complexity of data represents a major challenge for any user, mainly  
37 interested in the progress and performance status of her own area. At this regard, the paper describe  
38 the development of an application infrastructure<sup>2</sup> and the relative algorithms developed in the R  
39 language to syntetize and visualize the large sets of data in insightful indicators and statistics. Finally,  
40 the paper provides some inputs as regards the main messages and concepts to observe in the data  
41 comparison.

## 42 2. Literature review and other tools for open data analysis

43 The increasing and heterogeneous group of data users debating the implementation of  
44 programmes and the use of structural funds require an information dissemination strategy based on  
45 generally understandable concepts. At this regard, the use of visualizations as the easiest and fastest  
46 tools for human eye perception of patterns and trends recognition appears to be the best solution.  
47 However, the vastity of multi-dimensional information available rises the problem of successfully and  
48 easily stimulate visual reasoning synthetizing data using relatively simple tools.

49 Researchers are analysing increasingly large economic data sets generated in greater volumes adopting  
50 adequate tools and technologies. Big data often offers valuable information to be extracted and  
51 interpreted and time when simple bar charts or scatter plots were enough is long gone. Thus, the  
52 development of advanced data visualization techniques is becoming a necessary and challenging area  
53 of research and interest. Data visualization can help in making sense of large data sets by presenting  
54 the contents in an innovative visual format that does not require multiple tables or lots of rows and  
55 columns. Furthermore, the connection between several data sources generates newer and larger  
56 datasets leading to further discovery and information.

57 However, the increased complexity and volume of data collected, stored and made available by  
58 institutions and public bodies does not advance smoothly. Literature shows that open data government  
59 datasets still presents several barriers: lacks of adequate collection, classification, processing and  
60 presentation tools; non-standardized data description and formats, missingness or inchoerent data,thus  
61 poorly usable among different users and analytical approaches;<sup>[1]</sup>.

62 IT investments and skills devoted mainly to storing systems, architecture, software, hardware, security,  
63 networks and Web technologies without an explicit purpose of data exploitation adapts poorly to  
64 the new paradigm on the use of data as an asset for business intelligence and data science. This in  
65 turn affects the benefits of open data initiatives and sharing, especially at even lower level (i.e. local  
66 administrations, municipalities, etc).

67 As a response to the challenges of managing vast amounts of government data and making it accessible  
68 for different purposes and informational needs, Dawes explains the concepts of stewardship and  
69 usefulness. At this regards, among "stewardship proposals" for improvement he suggests to create and  
70 improve metadata for each data source, improve the data management system, adopt standard data  
71 formats. As "usefulness proposals", he suggests to provide easy-to-use basic features and improve  
72 and enhance searching and display of data [2]. Noveck [3] adds that is it also important to own high  
73 quality standards for dissemination among different needs and usage across citizens and other social  
74 actors. Merino et al. [4] consider the delivery of public data as opportune and reliable for better

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<sup>1</sup> <https://cohesiondata.ec.europa.eu/>

<sup>2</sup> <https://cohesion-data-visualization.shinyapps.io/ms-op/>

75 decisions making in government as well as for government accountability of public decisions and  
76 actions. The use of different technology tool for implementing open data initiatives is recognised  
77 as a "fit-the-right-tool-for-the-job" situation, i.e. each complex economic, social, political issue and  
78 the data it generates relate to different approaches and methods for information production and use  
79 [5],[6],[4],[7].

80 Government open data across different end-users are available by the intensive use of technology as IT  
81 tools and Web applications [1], [3].

82 IT tools and web applications are currently the engine of the debate based on open data as they allow to  
83 both provide the "raw material" to different typologies of users and receive new information and data  
84 from the same users, either being decision-makers, analysts, researchers and citizens [8],[9],[10]. There  
85 is a wide range of different technological tools available for policy analysis and data visualization. The  
86 use of flexible and powerful information technologies and various analytical methods are supported  
87 by several open data initiatives. This scenario is constantly evolving, but a brief overview of some  
88 common tools and platforms used to visualize and analyse open data is as follows:

- 89 • ESIF - Viewer<sup>3</sup> is a tool to search planned investments in European Structural and Investment  
90 Funds (ESIF) data (ERDF, CF, ESF and YEI). The tool contains data from the ESIF Operational  
91 Programmes (OP). The amounts in this tool are presented at regional level and include data  
92 from regional OPs, but also shares of national and transnational cooperation programmes. The  
93 user can search for planned investments per country, region, OP-type and different categories of  
94 intervention;
- 95 • ICT Monitoring<sup>4</sup> contains data from the ESIF Operational Programmes (OP) on planned ICT  
96 related investments. The amounts in this tool are presented at regional level. Users can search  
97 within three broad dimensions, amounts, keywords and financial forms;
- 98 • Regional Benchmarking<sup>5</sup> is an interactive tool for Regional Benchmarking which helps  
99 identifying structurally similar regions across Europe through statistical indicators;
- 100 • EU Trade<sup>6</sup> is a fully interactive web-based application for the visualization and the analysis of  
101 inter-regional trade flows and the competitive position of regions in Europe. The purpose of  
102 this tool is to make possible to assess regional assets and analyse a region's economic position  
103 as a first fundamental step in the process of building place-based and evidence-based regional  
104 policies and smart specialisation strategies;
- 105 • R&I Regional Viewer<sup>7</sup> allows to visualize and compare Research & Innovation investments under  
106 different funding channels and EU programmes across EU Regions, i.e. economic indicators  
107 from Eurostat, planned R&I-related investments under ESIF, and Horizon 2020 funding captured  
108 by stakeholders;
- 109 • YDS - Your Data Stories<sup>8</sup> is a platform that helps make sense of open and social data;
- 110 • ROUTE-TO-PA<sup>9</sup> is a multidisciplinary innovation project, that, by combining expertise and  
111 research in the fields of e-government, computer science, learning science and economy, is  
112 aiming at improving the impact, towards citizens and within society, of ICT-based technology  
113 platforms for transparency;
- 114 • Smarticipate<sup>10</sup> gives citizens access to data about their city enabling them to better support the  
115 decision-making process. Residents will also play an active role in verifying and contributing to  
116 data;

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3 <http://s3platform.jrc.ec.europa.eu/esif-viewer>

4 <http://s3platform.jrc.ec.europa.eu/ict-monitoring>

5 <http://s3platform.jrc.ec.europa.eu/regional-benchmarking>

6 <http://s3platform.jrc.ec.europa.eu/s3-trade-tool>

7 <http://s3platform.jrc.ec.europa.eu/synergies-tool>

8 <https://yourdatastories.eu/>

9 <http://routetopa.eu/>

10 <https://www.smarticipate.eu/>

- 117 • Big Data Europe<sup>11</sup> undertake the foundational work for enabling European companies to build  
118 innovative multilingual products and services based on semantically interoperable, large-scale,  
119 multi-lingual data assets and knowledge, available under a variety of licenses and business  
120 models;
- 121 • OpenBudgets<sup>12</sup> offers a toolbox to everyone who wants to upload, visualise and analyse fiscal  
122 data. From easy to use visualisations and high-level analytics to fun games and accessible  
123 explanations of public budgeting and corruption practices along with participatory budgeting  
124 tools, it caters to the needs of journalists, researchers, policy makers and citizens alike.
- 125 • OpenCoesione<sup>13</sup> shares information on the Italian projects financed through cohesion policy  
126 resources.

### 127 3. Data description

128 The data available in the Open Data Portal for the ESIF covers more than 530 Operational  
129 Programmes under the five ESI Funds: the European Agricultural Fund for Rural Development  
130 (EAFRD), the European Regional Development Fund (ERDF), the European Social Fund (ESF)  
131 with distinct data for the Youth Employment Initiative, the Cohesion Fund (CF) and the European  
132 Maritime and Fisheries fund (EMFF). Data are available in three financial datasets related to planned,  
133 implemented and paid resources and on a single achievement dataset with data on selected common  
134 indicators targets and implementation. The two most important financial variables related to the  
135 performance of regions in implementing their operational programmes are the project selection  
136 (resources allocated to investments) and the expenditure declared (resources actually disbursed  
137 to beneficiaries) as reported by the Managing Authorities of the programmes. The progress and  
138 performance of each Operational Programme is monitored against the financial planned amount  
139 decided during the planning phase at the beginning of the programming period in 2014.  
140 These data are available disaggregated by fund, Operational Programme, Priority Axis, Thematic  
141 Objectives<sup>14</sup> (i.e. the macro priorities of investment of the policy) and category of regions (more  
142 developed, less developed, transition). In terms of update, while the financial planned is subject  
143 to update only in case of within OP reallocation of resources, the financial implementation data are  
144 updated three times per year in the end of January, July and September. Likewise, disaggregation also  
145 applies to common indicators data whose update of implementation data is scheduled at the end of  
146 each year whereas targets are not subject to variations unless OPs modifications occur. Vastity of  
147 information, complexity of data structure and timing of update suggests the adoption of agile tools for  
148 easily fetch, parse, aggregate and visualize information instantaneously.

### 149 4. Cohesion open data: API and information management

150 In order to allow the largest degree of accessibility and exploitation by specialists and general  
151 public, datasets are accessible and usable in different format from the ESIF portal. Among these, a  
152 web service ensures the programmatic and continuous access to programmes information through an  
153 API. Data are exposed through several endpoints in a JSON structure that allows a fast fetching and  
154 parsing of data. The availability of data as web service has driven the architecture of the visualization  
155 application namely requiring the development of specific fetching, parsing and plotting functions. The  
156 following figure shows an overview of the application architecture.

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11 <https://www.big-data-europe.eu/>

12 <https://openbudgets.eu/>

13 <http://www.opencoesione.gov.it/>

14 [http://ec.europa.eu/regional\\_policy/en/policy/how/priorities](http://ec.europa.eu/regional_policy/en/policy/how/priorities)

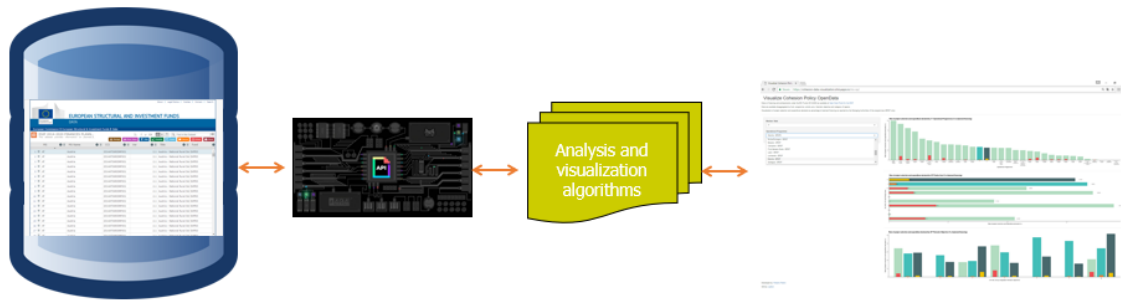


Figure 1. Web application architecture

157 When the application loads, data are parsed from the JSON endpoints exposing the database  
 158 tables and are processed server-side to extract, calculate and plot the OP information based on the user  
 159 inputs, namely the Member State and the name of the Operational Programme of interest. The simple  
 160 inputs menu allows to search for specific Member State and Operational Programme but also to access  
 161 the information of all the other EU programmes for an immediate comparison even beyond national  
 162 borders.

### 163 5. Data visualization and interactive statistics

164 As the main objective of the data analysis and visualization shall be to easily compare regional  
 165 programmes performance to justify EU investment and inform taxpayers on the progress of deployed  
 166 resources, all visualisations use a benchmarking approach either between different geographical levels  
 167 (EU, Member State, Operational Programme) or over time, observing the progress since the beginning  
 168 of the programming period. As regards the design and aesthetic of the figures, four specific features  
 169 have been taken into account when developing the visualization:

- 170 1. the barplot has been adopted being one of the most common and easy typology of data  
 171 visualization, especially for policy makers and general public users;
- 172 2. the barplot has been improved through the logic of the progress bar and nesting the two  
 173 main variables, namely the resources allocated for selection and disbursed for expenditure: this  
 174 visualization approach highlights their strict dependence and warns on anomalous progressing  
 175 patterns (e.g. high ratio of selection and low ratio of expenditure);
- 176 3. as already discussed, benchmarks either in terms of space or time have been added within the  
 177 same visualization aiming at emphasising the performance as a relative concept;
- 178 4. the adoption of dimension-specific patterns for easier concept-insight association, i.e. OPs in  
 179 descending order for ranking focus, Priority Axis with coordinate flip as a sort of race line,  
 180 Thematic Objectives as groups of bars to compare specific policy intervention fields.

181 These typology of visualization have received feedbacks and validation by a set of final users.

#### 182 5.1. Developing performance indicators

183 A preliminary aggregation and cumulation of data by geographical level allows to calculate the  
 184 main magnitudes used to develop the performance indicators. These are mainly represented by ratios  
 185 of progress on planned, namely the Project Selection as share of Planned Financing (EUR) and the  
 186 Expenditure Declared as share of Planned Financing (EUR).

$$\text{Rate of selection} = \frac{\sum_{op=1}^N \text{Selection}}{\sum_{op=1}^N \text{Planned}} * 100 \quad (1)$$

$$\text{Rate of expenditure} = \frac{\sum_{op=1}^N \text{Expenditure}}{\sum_{op=1}^N \text{Planned}} * 100 \quad (2)$$

## 187 5.2. Informative data visualization

188 The calculation of indicators by itself does not serve the purpose of providing information to  
 189 the user. For this reason, the visualization should be able to provide as many relevant information  
 190 as possible without affecting the comprehension of the message. Thus, a trade-off between the  
 191 complexity of the figure in terms of variables and dimensions considered and the informative power of  
 192 the figure has to be considered when structuring the view. At this regards, depending on the specific  
 193 information to transfer, each view aggregates and groups spatial or time dimensions as presented in  
 194 the following figures:

- 195 • **Ranking OPs within the same MS:** ratio of selection and expenditure by OP, comparing all OPs  
 196 in each MS with reference to the EU level in decreasing order;

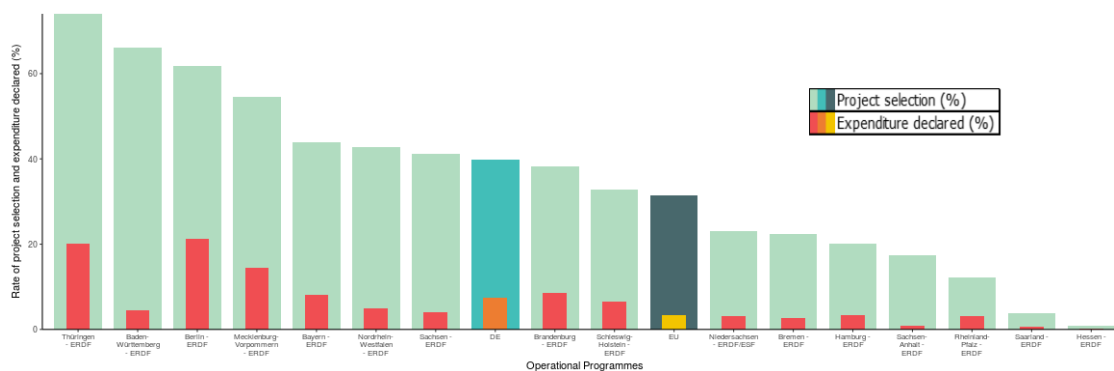


Figure 2. Rate of project selection and expenditure declared of Germany Operational Programmes (share of planned financing)

197 The algorithm behind the visualization ranks the OPs within a specific MS by rate of selection  
 198 as well as the MS and EU values. The figure shows that, despite the highest level of selection,  
 199 the first two regions have lower levels of expenditure. Despite some programmes show a very  
 200 low level of progress, Germany and the majority of german OPs are above the EU average both  
 201 in terms of selection and expenditure. However, in terms of planned resources, percentages  
 202 of implementation do suggest a slow advancement with only a maximum of 20% of resources  
 203 disbursed at almost half of the programming period 2014-2020.

- 204 • **Comparing Priority Axes of investment within OP:** ratio of selection and expenditure by Priority  
 205 Axis, comparing all the axis in each OP with reference to the overall OP level, the MS and EU  
 206 progress;

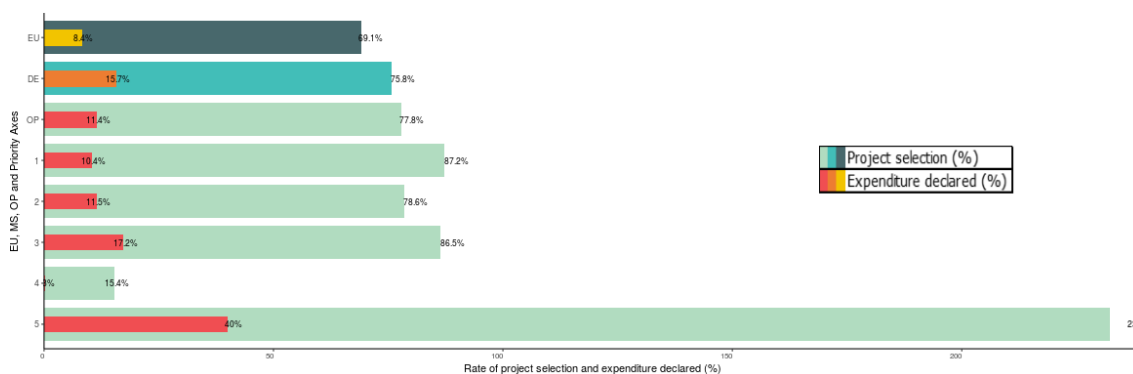


Figure 3. Rate of project selection and expenditure declared by Priority Axis (share of planned financing)



207 The figure shows a progress of the overall OP under assessment almost in line with the EU and  
 208 MS progress. Almost all the Priority Axis of the OP are progressing in terms of selection more  
 209 than the EU and MS level. However, Axis 4 shows a very low rate of selection and absence  
 210 of expenditure affecting the overall performance of the OP. This warns on possible issues and  
 211 obstacles in the delivery of resources for the specific type of investments related to the priority  
 212 and affects the homogeneous progress of the OP.

- 213 • **Comparing progress over time:** ratio of selection and expenditure by year between 2014 and  
 214 2017 with an overall visualization of the OP (left figure) progress and the development over time  
 215 of the OP specific axes (right figure);

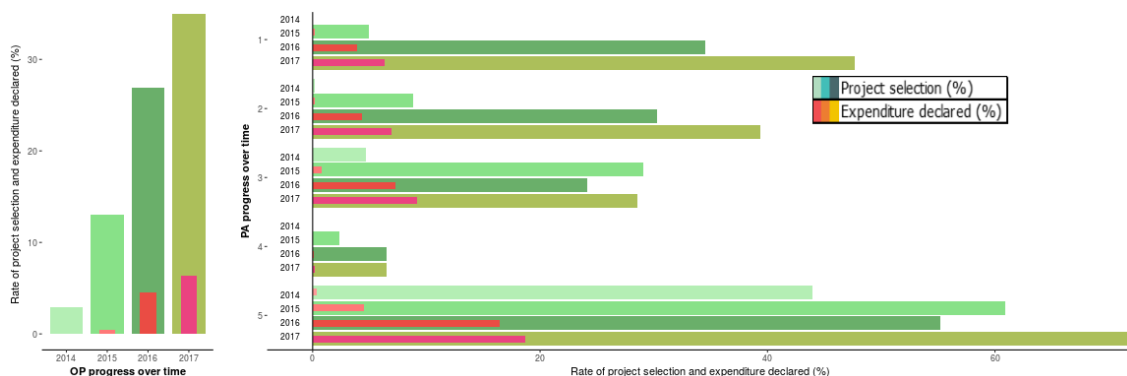


Figure 4. Rate of project selection and expenditure declared over time: OP and Axes details

216 Coherently with the natural progress of OP over the programming period, the left-side figure  
 217 shows the evolution of selection and expenditure over time with almost absence of resources  
 218 either allocated or disbursed in 2014 but an almost constant increase over the following years.  
 219 The right-side view shows the progress over time of each Priority Axis with a similar pattern of  
 220 development and, as already described, a critical situation in Axis 4 were in the last two years  
 221 there hasn't been any change either in selection or expenditure.

- 222 • **Comparing areas of investment:** ratio of selection and expenditure by Thematic Objectives of  
 223 the overall OP with benchmark to the Member State and EU levels.

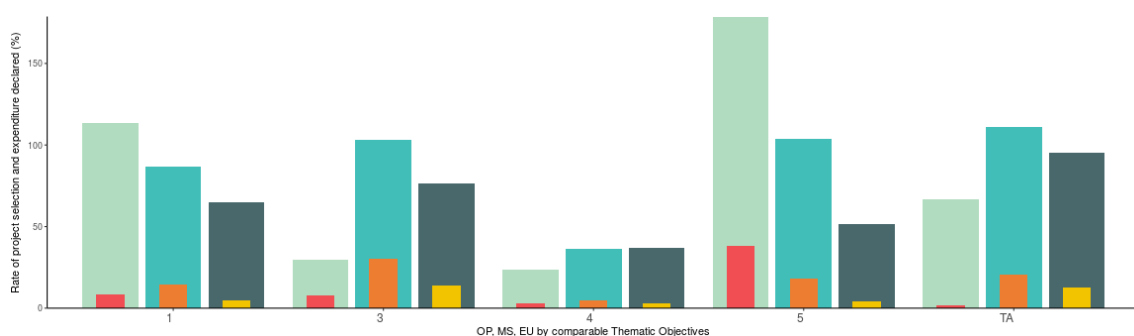


Figure 5. Rate of project selection and expenditure declared by Thematic Objective (share of planned financing)

224 The goal of these objectives is to focus financial resources on areas that deliver the highest benefits  
 225 to citizens, fostering synergies between these fields and avoiding an excessive fragmentation of  
 226 funding. This view allows for two typologies of comparison: comparing levels within TOs and

227 comparing each level between TOs. The figure shows a relative better selection performance of the  
228 OP compared to the MS and the EU level in TO 1 - *Strengthening research, technological development*  
229 *and innovation* and TO 5 - *Promoting climate change adaptation, risk prevention and management*. On  
230 the contrary, other OPs are doing better with the resources dedicated to the other TOs as MS  
231 values are higher. As regards the comparison of the different TOs of the OP, it shows a higher  
232 degree of progress variability if compared with the MS and EU variability between TOs.

## 233 6. Conclusions

234 The main aim of this paper is to describe the functioning of an agile web tool for data visualization  
235 of ESI funds to anyone interested in monitoring the development of the regional programmes and  
236 in particular citizens of the Union, Member State administrations, EU Institutions, policy makers,  
237 researchers and practitioners in regional policy. The political context and the financial and economic  
238 pressure on EU countries and regions budgets of the recent years have imposed a change in term of  
239 accountability and justification of public expenditure, a stronger need to inform taxpayers on public  
240 investments and to broaden the debate on cohesion policy and its future orientation. The analysis  
241 developed through the web tool are intended as a way of improving the awareness of regions on  
242 their effective management of funds and in informing the decision-making process with real-time  
243 available data. The benchmarking approach adopted has several limitations but also possible fields of  
244 improvements as it does not refer to measures based on the whole set of regions but only to levels and  
245 time comparison. However, beyond the realm of cohesion policy and structural funds, this data-driven  
246 approach could be further used for other aspects of regional planning and decision making. Moreover,  
247 this methodology could prove to be useful in the context of data-driven evaluation and policy-learning,  
248 especially taking into account the evolution of data over time. As regards this last point, it is both  
249 useful and productive for regions to put more effort into monitoring and analysis of implementation  
250 data to maximise impact of public resources in the current period of financial and economic pressure  
251 of countries budgets.

## 252 Abbreviations

253 The following abbreviations are used in this manuscript:

254	CF	Cohesion Fund
	EAFRD	European Agricultural Fund for Rural Development
	EMFF	European Maritime and Fisheries Fund
255	ERDF	European Regional Development Fund
	ESF	European Social Fund
	MA	Managing Authorities
	OP	Operational Programme

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