# Results of analysis of OJV data - a case study on data for Poland

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## Table of contents

| 1. | Onli | ine job vacancies - case studies in Statistics Poland            | 2 |
|----|------|--|---|
| 2. | Basi | ic characteristics of CEDEFOP OJV data for Poland                | 3 |
| 2  | 2.1. | Number of online job vacancies by NUTS levels and reference time | 3 |
| 2  | 2.2. | Number of online job vacancies by ESCO level, date and NUTS      | 4 |
| 2  | 2.3. | Number of online job vacancies by NACE, date and NUTS            | 4 |
| 2  | 2.4. | Number of online job vacancies by date                           | 5 |
| 3. | Pos  | sible new indicators   | 6 |

### 1. Online job vacancies - case studies in Statistics Poland

We have made some investigations on the possible use of Online job vacancies in Poland to support labour market statistics. Several research papers were published regarding methodological issues as well as reports. The most recent paper was published in September 30<sup>th</sup> and is available online only in Polish:

Maślankowski J., The collection and analysis of the data on job advertisements with the use of big data, Wiadomości Statystyczne. The Polish Statistician, 2019, vol. 64, 9, 60-74.

Bearing in mind the differences in definition of online job vacancy vs. job demand in surveys, we can find a comparison of number of vacancies based on traditional survey and online job vacancies. This information is included in the table presented in Figure 1.

Figure 1. Table presenting values for survey data vs. OJV data

#### TABL. 1. WOLNE MIEJSCA PRACY WEDŁUG SPRAWOZDANIA Z-05 A OFERTY PRACY W ŹRÓDŁACH BIG DATA W II KWARTALE 2017 R.

| Wyszczególnienie                                   | Z-05<br>(wakaty) | Big data<br>(oferty pracy) |
|--|------------------|----------------------------|
|  | w t              | ys.                        |
| Total Ogółe ma                                     | Survey<br>122,0  | OJV data<br>110,0          |
| w tym:<br>Woj. mazowieckie <mark>Voivodship</mark> | 27,9             | 23,2                       |
| Pracownicy using i sprzedawcy Sales industry       | 14,5             | 15,3                       |
| a Dane za II kwartał 2018 r. wynoszą odpov         |                  | 1,0.                       |
| Ž r ć d l o: opracowanie włacne oraz CLIC //       | 2040)            |                            |

Ź r ó dł o: opracowanie własne oraz GUS (2018)

Source: Maślankowski J., The collection and analysis of the data on job advertisements with the use of big data, Wiadomości Statystyczne. The Polish Statistician, 2019, vol. 64, 9, 60-74.

We can see that the total number of online job vacancies is a little smaller comparing the number of vacancies based on traditional survey. The same result is when we investigate Mazowieckie voivodship (NUTS-2). However, making analysis of specific occupation can result in reverse dependence - e.g., in service and sales workers, the number of job vacancies by traditional survey is smaller than the result of OJV data.

The most important conclusion is that there are several duplicates in the data and one of the key issues in data processing is to deliver a dedicated de-duplication framework. Another issue is that number of OJV data in different websites is very shaky and can change significantly year-by-year. Average number of online job vacancies in 2<sup>nd</sup>/3<sup>rd</sup> quarter of 2017/2018 was presented in Figure 2 (by four country portals, two dedicated portals and one regional).

Figure 2. Average number of job vacancies data by year and type of OJV portal

TABL. 2. UŚREDNIONA LICZBA OFERT PRACY W II i III KWARTALE 2018 2017 Portale Ogólnopolskie: 140 124 19 86 54 0,6 0,8 8,5 Country: 46 39 Branzowe: Dedicated: Regionalny Regional: U w a g a. Cyfry w kolumnie Portale oznaczają kolejne badane portale

Ż r ó dł o: opracowanie własne

Source: Maślankowski J., The collection and analysis of the data on job advertisements with the use of big data, Wiadomości Statystyczne. The Polish Statistician, 2019, vol. 64, 9, 60-74.

As it was demonstrated in Figure 2, we can observe very shaky data sources, in terms of number of job vacancies. It leads to the necessity of the use of various Internet portals with OJV without concentrating on specific ones.

#### 2. Basic characteristics of CEDEFOP OJV data for Poland

To have a general overview of CEDEFOP data for Poland, four basic indicators were prepared and analysed. It includes:

- 1) Number of online job vacancies by NUTS levels (macro\_region, region, province, city) and reference time (year\_grab\_date, month\_grab\_date, day\_grab\_date vs. year\_expire\_date, month\_ expire\_date, day\_expire\_date)
- 2) Number of online job vacancies by ESCO code (esco\_level\_1 4), date, NUTS
- 3) Number of online job vacancies by NACE (macro\_sector, sector), date, NUTS
- 4) Number of online job vacancies by day (to show seasonal effect e.g., total 1444290 for Poland in the last quarter of 2018)

Total number of OJV data in CEDEFOP database for Poland and published in Polish language is 2396651.

The strength of this dataset is a timeliness and cost of acquiring data. However there are some weaknesses, including different definitions of job demand/job vacancies, possible duplicates in the data and unknown target population.

In subchapters 2.1-4, indicators were shown with the value of 10 first columns having the biggest number of observations.

#### 2.1. Number of online job vacancies by NUTS levels and reference time

The goal of this indicator is to show the cities in which there is the largest number of online job vacancies. It allows to check possible duplicates and shows if there are any issues with algorithms.

Table 1. Number of OJV by cities

|   | macro_region                      | region            | province           | city     | year_grab<br>_date | month_grab<br>_date | day_grab_<br>date | Number_of_<br>OJV |
|---|-----------------------------------|-------------------|--------------------|----------|--------------------|---------------------|-------------------|-------------------|
| 1 | REGION<br>POŁUDNIOWY              | Małopolskie       | Miasto<br>Kraków   | Kraków   | 2018               | 9                   | 4                 | 3333              |
| 2 | REGION<br>CENTRALNY               | Mazowieckie       | Miasto<br>Warszawa | Warszawa | 2019               | 2                   | 19                | 3244              |
| 3 | REGION<br>POŁUDNIOWO-<br>ZACHODNI | Dolnośląskie      | Miasto<br>Wrocław  | Wrocław  | 2018               | 9                   | 4                 | 2828              |
| 4 | REGION<br>CENTRALNY               | Mazowieckie       | Miasto<br>Warszawa | Warszawa | 2019               | 6                   | 26                | 2642              |
| 5 | REGION<br>CENTRALNY               | Łódzkie           | Miasto<br>Łódź     | Łódź     | 2018               | 9                   | 4                 | 2465              |
| 6 |                                   |                   |                    |          | 2019               | 6                   | 10                | 2389              |
| 7 | REGION<br>CENTRALNY               | Mazowieckie       | Miasto<br>Warszawa | Warszawa | 2018               | 7                   | 12                | 2261              |
| 8 | REGION<br>CENTRALNY               | Mazowieckie       | Miasto<br>Warszawa | Warszawa | 2019               | 2                   | 18                | 2233              |
| 9 | REGION<br>PÓŁNOCNO-<br>ZACHODNI   | Wielkopolski<br>e | Miasto<br>Poznań   | Poznań   | 2018               | 9                   | 4                 | 2215              |

In the table we can see that there are some regions with blank names - it means that probably it was not possible to identify a region with algorithms already used.

#### 2.2. Number of online job vacancies by ESCO level, date and NUTS

The second indicator is the analysis of job vacancies by ESCO level. It is important to know whether occupations are ranked the same way as in publications from traditional surveys. It was presented in Table 2.

Table 2. General overview of number of online job vacancies

|   | esco_level_1                     | esco_level_2                                   | esco_level_3                                    | esco_level_4                                   | Number_of_OJV |
|---|----------------------------------|--|---|--|---------------|
| 0 | Service and sales workers        | Personal service workers                       | Waiters and bartenders                          | Waiters  | 178751        |
| 1 | Professionals                    | Business and administration professionals      | Administration professionals                    | Training and staff development professionals   | 141062        |
| 2 | Clerical support workers         | Customer services clerks                       | Client information workers                      | Enquiry clerks                                 | 121227        |
| 3 | Elementary occupations           | Labourers in mining, construction, manufacturi | Transport and storage labourers                 | Freight handlers                               | 71727         |
| 4 | Elementary occupations           | Labourers in mining, construction, manufacturi | Manufacturing labourers                         | Hand packers                                   | 69882         |
| 5 | Service and sales workers        | Sales workers                                  | Shop salespersons                               | Shop sales assistants                          | 59800         |
| 6 | Elementary occupations           | Cleaners and helpers                           | Domestic, hotel and office cleaners and helpers | Cleaners and helpers in offices, hotels and ot | 56725         |
| 7 | Clerical support workers         | Numerical and material recording clerks        | Material-recording and transport clerks         | Stock clerks                                   | 55436         |
| 8 | Craft and related trades workers | Handicraft and printing workers                | Handicraft workers                              | Potters and related workers                    | 47308         |
| 9 | Service and sales workers        | Sales workers                                  | Other sales workers                             | Contact centre salespersons                    | 45069         |

Data in table 2 shows that the largest number of job vacancies in the reference period is the largest for service and sales workers. This occupation is also identified as the most popular in official statistics data.

#### 2.3. Number of online job vacancies by NACE, date and NUTS

Next indicator concerns the sector having the biggest number of online job vacancies data. It was shown in table 3.

Table 3. Number of OJV by region, sector and date

|   |                                 |   | and the same                         |                    |                     | december det      | New box of O.L.   |
|---|---------------------------------|---|--------------------------------------|--------------------|---------------------|-------------------|-------------------|
|   | macro_regio<br>n                | macro_sector  | sector                               | year_grab_<br>date | month_grab_dat<br>e | day_grab_dat<br>e | Number_of_OJ<br>V |
| 0 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 2                   | 19                | 5558              |
| 1 | REGION<br>POŁUDNIOWY            | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 2                   | 19                | 3679              |
| 2 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 2                   | 18                | 3346              |
| 3 | REGION<br>PÓŁNOCNO-<br>ZACHODNI | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 2                   | 19                | 3291              |
| 4 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 6                   | 26                | 3219              |
| 5 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 3                   | 1                 | 3133              |
| 6 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 4                   | 20                | 3118              |
| 7 | REGION<br>CENTRALNY             | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 4                   | 19                | 2915              |
| 8 |                                 | Accommodatio<br>n and food<br>service<br>activities | Food and beverage service activities | 2018               | 9                   | 4                 | 2902              |
| 9 | REGION<br>PÓŁNOCNY              | Human health<br>and social<br>work activities       | Human<br>health<br>activities        | 2019               | 2                   | 19                | 2701              |

In every region one of macro sector is dominating - which is human health and social work activities. However, in row 8, we can see that not all sectors have the location assigned.

#### 2.4. Number of online job vacancies by date

The aim of this indicator is to show seasonal effect e.g., total 1444290 for Poland in the last quarter of 2018. In Table 4, we can see the number of OJV by date.

Table 4. Number of OJV by date

|   | year_grab_date | month_grab_date | day_grab_date | Number_of_OJV |
|---|----------------|-----------------|---------------|---------------|
| 0 | 2018           | 9               | 4             | 73619         |
| 1 | 2019           | 2               | 19            | 22938         |
| 2 | 2019           | 2               | 6             | 21886         |
| 3 | 2018           | 7               | 12            | 21059         |
| 4 | 2019           | 4               | 18            | 20686         |
| 5 | 2019           | 6               | 26            | 20327         |
| 6 | 2019           | 2               | 18            | 19465         |
| 7 | 2019           | 3               | 20            | 18643         |
| 8 | 2019           | 4               | 14            | 18639         |
| 9 | 2018           | 7               | 17            | 18216         |

A quick analysis of the data presented in Table 4 led to the conclusion that there is a big disproportion in number of OJV by date, e.g.,  $4^{th}$  of September 2018 - 73.6 thous.,  $19^{th}$  of February 2019 - 22.9 thous. Please note that data in descending order by Number of OJV were presented in Table 4.

# 3. Possible new indicators

One of the possible indicators that is not covered in online tool Skills OVATE, is the analysis of soft skills needed by educational attainment. For example, the following tables shows what skills are the most demanded by different educational attainment.

Table 5. Examples of number of the most popular skills by educational attainment

|          | educational_level                          | escoskill_level_3                  | number         |
|----------|--|------------------------------------|----------------|
| 1        | Post-secondary non-tertiary education      | use a computer                     | 358069         |
| 2        | Post-secondary non-tertiary education      | adapt to change                    | 295066         |
| 3        | Post-secondary non-tertiary education      | work as a team                     | 219734         |
| 4        | Post-secondary non-tertiary education      | teamwork principles                | 218418         |
| 5        | Post-secondary non-tertiary education      | Smalltalk                          | 198743         |
| 6        | Post-secondary non-tertiary education      | use communication techniques       | 184131         |
| 7        | Post-secondary non-tertiary education      | think creatively                   | 181362         |
| 8        | Post-secondary non-tertiary education      | public relations                   | 180556         |
| 9        | Post-secondary non-tertiary education      | job market offers                  | 147570         |
| 10       | Post-secondary non-tertiary education      | show responsibility                | 138571         |
| 1        | Short-cycle tertiary education             | adapt to change                    | 14767          |
| 2        | Short-cycle tertiary education             | use a computer                     | 11708          |
| 3        | Short-cycle tertiary education             | work as a team                     | 11169          |
| 5        | Short-cycle tertiary education             | use microsoft office               | 8014           |
| 7        | Short-cycle tertiary education             | show responsibility                | 6632           |
| 8        | Short-cycle tertiary education             | teamwork principles                | 6382           |
| 9        | Short-cycle tertiary education             | create solutions to problems       | 4308           |
| 10       | Short-cycle tertiary education             | problem solving                    | 4158           |
| 13       | Short-cycle tertiary education             | Smalltalk                          | 2963           |
| 14       | Short-cycle tertiary education             | think creatively                   | 2721           |
| 16       | Short-cycle tertiary education             | quality standards                  | 2612           |
| 17       | Short-cycle tertiary education             | manage time                        | 2605           |
| 0        | Master or equivalent                       | use a computer                     | 25585          |
| 1        | Master or equivalent                       | adapt to change                    | 25027          |
| 2        | Master or equivalent                       | work as a team                     | 22402          |
| 3        | Master or equivalent                       | teamwork principles                | 21603          |
| 4        | Master or equivalent                       | create solutions to problems       | 17214          |
| 5        | Master or equivalent                       | think creatively                   | 15996          |
| 7        | Master or equivalent                       | problem solving                    | 15881          |
| 8        | Master or equivalent                       | project management                 | 14788          |
| 9        | Master or equivalent                       | use communication techniques       | 13831          |
| 10       | Master or equivalent                       | develop strategy to solve problems | 13600          |
| 11       | Master or equivalent                       | show responsibility                | 12988          |
| 12       | Master or equivalent                       | analyse problems for opportunities | 12357          |
| 14<br>15 | Master or equivalent  Master or equivalent | think analytically                 | 11122<br>10987 |
|          | Master or equivalent                       | communication                      | 111UX /        |

It is worth to note that almost each OJV have assigned educational attainment by ISCED code (International Standard Classification of Education). It means that we can make analysis in 8-levels scale, from "no education needed" to "doctoral educational attainment".

A suggested approach is to calculate the following indicator that is not presented in the current Skills OVATE tool:

Skills needed by educational attainment = 
$$\frac{Nsk}{OIVed}$$

where:

Nsk - Number of OJV for a specific skill by educational attainment,

OJVed - Number of OJV for a specific skill by educational attainment

The results were presented in Table 6.

Table 6. Percentage of skills needed by educational attainment

| ID | Educational attainment                | Skills                       | Number of OJV | Percentage in total number of OJV |
|----|---------------------------------------|------------------------------|---------------|-----------------------------------|
| 0  | Bachelor or equivalent                | adapt to change              | 44058         | 64,8%                             |
| 1  | Bachelor or equivalent                | work as a team               | 39599         | 58,2%                             |
| 2  | Bachelor or equivalent                | use a computer               | 39386         | 57,9%                             |
| 3  | Bachelor or equivalent                | teamwork principles          | 35566         | 52,3%                             |
| 4  | Bachelor or equivalent                | use microsoft office         | 29731         | 43,7%                             |
| 5  | Bachelor or equivalent                | create solutions to problems | 27814         | 40,9%                             |
| 0  | Master or equivalent                  | use a computer               | 25585         | 64,4%                             |
| 1  | Master or equivalent                  | adapt to change              | 25027         | 63,0%                             |
| 2  | Master or equivalent                  | work as a team               | 22402         | 56,4%                             |
| 3  | Master or equivalent                  | teamwork principles          | 21603         | 54,4%                             |
| 4  | Master or equivalent                  | create solutions to problems | 17214         | 43,3%                             |
| 5  | Master or equivalent                  | think creatively             | 15996         | 40,2%                             |
| 0  | Post-secondary non-tertiary education |                              | 826958        | 46,6%                             |
| 1  | Post-secondary non-tertiary education | use a computer               | 358069        | 20,2%                             |
| 2  | Post-secondary non-tertiary education | adapt to change              | 295066        | 16,6%                             |
| 3  | Post-secondary non-tertiary education | work as a team               | 219734        | 12,4%                             |
| 4  | Post-secondary non-tertiary education | teamwork principles          | 218418        | 12,3%                             |

In Table 6 we can see that no skills are needed for ca. 46.6% of OJV for post-secondary non-tertiary education. For Master graduates, the most skill needed is to use a computer (64.4%). Employers expect from Bachelor graduates a skill "adapt to change" in 64.8% of job vacancies.

This indicator helps to develop the educational strategy for different schools.