

# Multivariate and Multicriteria Evaluation of Labour Market Situation

Monika Sedenkova and Jiri Horak

NOTA DI LAVORO 67.2006

# **APRIL 2006**

KTHC - Knowledge, Technology, Human Capital

Monika Sedenkova and Jiri Horak, VSB – Technical University, Institute of Geoinformatics

This paper can be downloaded without charge at:

The Fondazione Eni Enrico Mattei Note di Lavoro Series Index: http://www.feem.it/Feem/Pub/Publications/WPapers/default.htm

Social Science Research Network Electronic Paper Collection: http://ssrn.com/abstract=897902

The opinions expressed in this paper do not necessarily reflect the position of Fondazione Eni Enrico Mattei Corso Magenta, 63, 20123 Milano (I), web site: www.feem.it, e-mail: working.papers@feem.it

# Multivariate and Multicriteria Evaluation of Labour Market Situation

# Summary

Nowadays the analysts of labour markets have a lot of different data and indicators that can be used for the evaluation of the labour market and monitor its development. But such a great number of monitoring determinants can create problems both with the evaluation and with the description of the situation of the labour market. Thus it is necessary to select a limited number of important indicators. A tool that can help with the selection of these indicators is a method of multidimensional statistics – multivariate analysis. In some cases it is necessary to use only one complex indicator that can evaluate the labour market from a lot of aspects. For a solution we can use multicriteria evaluation. These methods are described in this paper. We recommend a procedure for the in-depth study of the labour market situation.

Keywords: Labour Market, GIS, Factor Analysis, Multicriteria Evaluation

# JEL Classification: C, C3, C30

This paper was presented at the First EURODIV Conference "Understanding diversity: Mapping and measuring", held in Milan on 26-27 January 2006 and supported by the Marie Curie Series of Conferences "Cultural Diversity in Europe: a Series of Conferences", EURODIV, Contract No. MSCF-CT-2004-516670.

Address for correspondence:

Monika Sedenkova VSB – Technical University Institute of Geoinformatics 17.listopadu 15 708 33 Ostrava-Poruba Czech Republic E-mail: monika.sedenkova.hgf@vsb.cz

#### Introduction

The evaluation of labour market situation is associated with analysis of reasons for existing status, prediction of future development and searching of appropriate tools, which can influence evolution positive way. The labour market is determined by a set of indicators ranging from global to local aspects and covering various economic, demographic, geographical and others factors.

The request of deeper study and associated intended application of economical and administrative tools lead to the demand of utilisation of wider spectrum of indicators, but also deployment of more advanced procedures of their processing e.g. application of multivariate analysis.

Factor analysis belongs to the most frequent used methods of multivariate analysis. It contributes to the identification of synthetic latent factors, on which relationships and behaviour of primary indicators can be studied. Following multidimensional methods of classification provide outputs suitable for regionalisation of territory (typically classification of administrative units), results of which could be applied for tailoring various economical/administrative incentive or prohibitive tools acting in the territory.

Main issue of such method's application is hidden directly in the fundament. They are based on the pure statistical approach to the evaluation, where the situation is evaluated and "weighted" on the base of measured data, calculation of artificial factors or e.g. identification of statistical significant homogenous clusters of municipalities. We are fully dependent on the measured data set used for processing; even a validation of results is applied for the same set of data. Thus the results are fixed with used data. Preprocessing with a new set of data can lead to different results and the robustness of results does not have to be satisfactory.

Although expert opinions are taking into account during the interpretation process of statistical results, still only a relatively small place remains for soft data and experts evaluation. Results can be more or less accepted by decision makers, who frequently are not confident to such artificial factors. They also pointed out issues connected with implementation of complicated sets of thresholds (aiming to for e.g. delimitation of tools acting) to the practice.

Due to these reasons one of the main practical results of multivariate analysis can be a substantial reduction of analysed data space dimensionality and selection of these indicators, which appear to be sufficient for description of labour market situation.

This step may be followed by multicriteria evaluation combining measured data with expert setting of thresholds and limits. The output of multicriteria evaluation may lead to calculation of 1 complex synthetic indicator, which is applicable for simplified evaluation of labour market situation. Such indicator can be perceived as more understandable and acceptable for decision makers.

#### Methodology

On the base of practical results of labour market analysis provided by a group of economists, geoinformatics and statisticians since 1998 following procedure for deeper study of labour market situation is recommended:

- 1. collection of wider range of descriptors including commonly used indicators of unemployment status (like rate of unemployment) as well as demographical and geographical indicators.
- 2. multivariate analysis after obligatory data modification and testing provide e.g. factor analysis, or cluster analyses for regionalisation of the territory
- 3. selection of most significant indicators suitable for evaluation of labour market situation (based both on statistical evaluation and expert evaluation)
- 4. multicriteria evaluation of selected indicators expert evaluation of weights for indicators (with respect to results of monovariate and multivariate statistical analyses), setting of thresholds or limits for impact levels, and optional synthesis to 1 indicator called e.g. "criticality" or "seriousness".

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 1 EURODIV 26.-27.1.2006 Milan, Italy.

#### ad 1. collection of descriptors

First it is necessary to determine wide list of indicators describing the situation. The set of indicators is usually prepared according expert's opinion. In the process the utilisation of effective methodology (e.g. PSR, model developed by OECD, or DPSIR - the causal framework for describing the interactions between society and the environment adopted by the European Environment Agency) and corresponding diagram techniques may eliminate the risk of important factors omission.

The list of indicators can be divided into two categories:

### A) short-term indicators

Except of unemployment rate they typically describe the unemployment structure and selected demographical factors. For unemployment structuring the share of endangered groups of people or unemployed is usually used.

Examples:

- share of number of registered unemployed older than 50 year old,
- share of number of registered unemployed with basic education,
- share of number of registered unemployed who are registered longer than 12 month,
- share of number of registered unemployed younger than 24 years (15-24 years)

### B) long -term indicators

Long -term indicators describe reasons of existing labour market situation and its evolution. They mainly include demographical, economical and geographical factors.

Examples:

- demographic share of population 0-14 year old to total number of population
- migration short-term to work share of new registered working opening to number of economic active population, share of commuting employees
- migration long-term to move increase of migration population to number of 1000 of population

Traffic accessibility of analysed place expressed by different indicators [5] like:

- sum of road distances to all important employers (all distances shorter than certain distance e.g. 100 km)
- sum of transport costs of public means to all important employers within 100 km
- count of connections provided by public transport to all important employers within 100 km

### ad 2. multivariate analysis

Factor analysis usually follows the procedure:

- 1. selection of factor analysis type: aggregation of variables
- 2. selection of variables. Check the size of file the count of records should exceed the number of variables more than 5 times.
- 3. checking initial assumptions (normality, linearity, homoscedascity, homogeneity). Make necessary transformation.
- 4. selection of factor method and count of factors

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 2 EURODIV 26.-27.1.2006 Milan, Italy.

For factor extraction following methods can be applied: principal components, MINRES (Unweighted least squares) and maximum likelihood. We use the method of principal components. Only factors with eigenvalue more than 1 are selected.

- 5. selection of method for factor rotation and interpretation
  - To improve interpretation of results, rotation with varimax method is used. The varimax minimises the number of variables having high absolute values of loads in the factor matrix Kaiser's rule. Other suitable methods of factor rotation are quartimax or equamax.
- 6. validation of factor matrix
- 7. application of factor analysis results

Concerning classification methods, K-Means Cluster Analysis, Hierarchical Cluster Analysis, Q-Factor Analysis and MultiDimensional Scaling [2] are assumed to be favourite methods.

#### ad 3. selection of most significant indicators

According to the statistical results (e.g. factor loads) significant indicators can be selected. Results have to be examined by specialist for labour market to modify and fulfil the selection with respect to practical knowledge of suitability, validity and accessibility of such indicators.

#### ad 4. multicriteria evaluation of selected indicators

The simple variant of multicriteria evaluation is weighted linear combination. To each factor a certain weight  $w_i$  is assigned and all factors are standardised into the same number range  $(x_i)$ . The resultant indicator is then usually designated as suitability, in this case more appropriately as "criticality" (C). [2]

$$C = \sum w_i \cdot x_i \tag{1}$$

 $\begin{array}{l} C-criticality\\ w_i-indicator weight\\ x_i-indicator score \end{array}$ 

If the final calculated "criticality" is to acquire values moving in the interval [0,1], it is necessary before the performance of multicriteria evaluation to standardise the input values of indicators into the same range of values, i.e. the interval [0,1]. Then the value 0 expresses the lowest rate of criticality, 1 means the highest rate of criticality. Standardisation was carried out according to the following formula:

$$X = \frac{x_{\text{orig}} - x_{\min}}{x_{\max} - x_{\min}}$$
(2)

 $\begin{array}{l} x-\text{standardised value} \\ x_{\text{orig}}-\text{initial value} \\ x_{\text{min}}-\text{minimum value} \\ x_{\text{max}}-\text{maximum value} \end{array}$ 

To determine the weights of indicators Saaty's method of pairwise comparison was selected. [6]

The technique of pairwise comparison developed by Thomas Saathy in the 70's and 80's in connection with the multicriteria decision-making method called the Analytical Hierarchy Process (AHP) represents a theoretically based approach to the calculation of the weights represented by the relative importance of criteria. The weights are not assigned directly, but they represent the most suitable set of weights obtained from the eigenvectors of the square reciprocal matrix used for comparing all possible pairs of criteria.

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 3 EURODIV 26.-27.1.2006 Milan, Italy.

Thus, when constructing the weights, the matrix of pairwise comparisons is used as a basis. In it, the intensity of the importance of one criterion against the others, or the relations of the importance (weight relations) of the criterion against the other criteria is expressed. For the description of the intensity (i.e. relation) of importance, values moving within the interval from 1 to 9, or 1 to 1/9 must be used.

For the assignation of weights, the following verbal comparative scale serves.

|  | Weight of 1 <sup>st</sup> factor |
|--|----------------------------------|
| 1st factor extremely more important than the second            | 9                                |
| 1st factor very strongly more important than the second        | 7                                |
| 1st factor strongly more important than the second             | 5                                |
| 1st factor moderately more important than the second           | 3                                |
| 1st factor as important as the second                          | 1                                |
| 2nd factor moderately more important than the first            | 1/3                              |
| 2nd factor strongly more important than the first              | 1/5                              |
| 2nd factor very strongly more important than the first         | 1/7                              |
| 2 <sup>nd</sup> factor extremely more important than the first | 1/9                              |

table 1 Determination of weight relations according to Saaty

Thus if the  $1^{st}$  factor is moderately less important in relation to the  $2^{nd}$  assessed factor, it is assigned the weight of 1/3 and the  $2^{nd}$  factor the weight of 3. Pair weights were written into the matrix.

On the diagonal of the square matrix, the value is 1 (we compare the same factor). The matrix is symmetrical along this diagonal. With the matrix of pair weights constructed like that, the eigenvector of the greatest eigenvalue of this matrix will be calculated and from it, the set of weights will be derived.

#### 1st case study

Analysis of labour market situation in district of Frýdek-Místek was carried out with data from labour offices from the period of 1999-2002 (see table 2).

| MN        | rate of unemployment [%]  |
|-----------|---|
| PZ_U      | Proportion of female the total number of job applicants [%]                                 |
| PC0017_U  | Proportion of age group below 17 years old [%]  |
| PZ0017_UZ | Proportion of female age group below 17 years old   |
| PC1824_U  | Proportion of age group 18-24 years [%]   |
| PZ1824_UZ | Proportion of female age group 18-24 years [%]  |
| PC5099_U  | Proportion of age group 50 and more years [%]   |
| PZ5099_UZ | Proportion of female age group 50 and more years [%]  |
| PCVABC_U  | Proportion of job applicants with basic education to the total number of job applicants [%] |
| PZVABC_UZ | Proportion of female job applicants with basic education [%]                                |
| PCVH_U    | Proportion of skilled job applicants [%]  |
| PZVH_UZ   | Proportion of skilled female job applicants [%]   |
| PCVKLM_U  | Proportion of job applicants graduated secondary school [%]                                 |
| PZVKLM_UZ | Proportion of female job applicants graduated secondary school [%]                          |
| PCZPS_U   | Proportion of handicapped job applicants [%]  |
| PZZPS_UZ  | Proportion of female handicapped job applicants [%]   |
| PCE6_U    | Proportion of job applicants registered more than 6 months [%]                              |
| PZE6_UZ   | Proportion of female job applicants registered more than 6 months [%]                       |
| PCE12_U   | Proportion of job applicants registered more than 12 months [%]                             |
| PZE12_UZ  | Proportion of female job applicants registered more than 12 months [%]                      |
| PCKZAM9_U | Proportion of applicants requiring unqualified job (labourer) [%]                           |

table 2. Review of available data

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 4 EURODIV 26.-27.1.2006 Milan, Italy.

| PZKZAM9_UZ | Proportion of female applicants requiring unqualified job (labourer) [%]              |
|------------|---|
| PCABS_U    | Proportion of graduated job applicants [%]  |
| PZABS_UZ   | Proportion of female graduated job applicants [%]                                     |
| PCMLA_U    | Proportion of young job applicants [%]  |
| PZMLA_UZ   | Proportion of young female job applicants [%]   |
| PCABSE6_U  | Proportion of graduated job applicants registered more than 6 months [%]              |
| PZABSE6_UZ | Proportion of female graduated job applicants registered more than 6 months [%]       |
| PCMLAE6_U  | Proportion of graduated young job applicants registered more than 6 months [%]        |
| PZMLAE6 UZ | Proportion of female graduated young job applicants registered more than 6 months [%] |

Data was standardised with Z-score to the normal distribution. The method of principal components was applied for factor extraction. Only factors with eigenvalue more than 1 were selected. The rotation with varimax method and Kaiser's rule were performed to improve interpretation of results.

|            | Component |           |           |           |           |           |           |           |           |
|------------|-----------|-----------|-----------|-----------|-----------|-----------|-----------|-----------|-----------|
|            | 1         | 2         | 3         | 4         | 5         | 6         | 7         | 8         | 9         |
| PZVABC_UZ  | ,889      | 7,126E-03 | -2,76E-02 | 5,292E-02 | 4,899E-03 | ,221      | -9,64E-02 | -,182     | 2,526E-02 |
| PCVABC_U   | ,853      | -,107     | -1,10E-02 | -4,74E-02 | 1,131E-02 | ,327      | -3,55E-02 | 9,307E-02 | -2,92E-02 |
| PCVKLM_U   | -,756     | ,109      | 4,226E-02 | -3,01E-02 | 7,739E-02 | ,533      | -5,05E-02 | -2,96E-02 | 6,741E-02 |
| PZVKLM_UZ  | -,706     | 6,673E-02 | -9,30E-02 | ,117      | -1,54E-02 | ,385      | ,297      | ,315      | ,111      |
| PZKZAM9_UZ | ,679      | ,177      | -9,10E-02 | ,213      | -,183     | -8,79E-02 | -9,91E-02 | ,173      | ,104      |
| PCKZAM9_U  | ,623      | ,134      | -,135     | ,264      | -4,31E-02 | -7,56E-02 | 9,376E-02 | ,399      | 9,923E-02 |
| MN         | ,481      | -,201     | -3,75E-03 | 2,498E-02 | -8,83E-02 | -,285     | -,117     | ,419      | -,138     |
| PZABS_UZ   | 7,065E-02 | ,925      | -1,21E-02 | 2,777E-02 | ,135      | 1,315E-02 | 5,929E-03 | ,187      | -1,93E-02 |
| PZABSE6_UZ | 8,983E-02 | ,908      | -1,92E-02 | 4,339E-02 | 9,217E-02 | -7,88E-03 | 4,226E-02 | ,134      | -6,12E-02 |
| PCABS_U    | -6,04E-02 | ,854      | -9,69E-03 | 1,645E-02 | ,317      | 9,479E-03 | -1,77E-02 | -,147     | 1,801E-02 |
| PCABSE6_U  | -8,84E-02 | ,829      | 2,850E-02 | -2,48E-02 | ,236      | ,100      | -9,63E-02 | -,178     | -9,58E-02 |
| PZMLA_UZ   | -4,58E-02 | -3,34E-02 | ,946      | 4,872E-05 | -5,19E-02 | -3,38E-02 | 1,754E-03 | 4,722E-02 | 7,490E-02 |
| PCMLA_U    | 2,967E-04 | 5,504E-02 | ,941      | -2,21E-02 | 3,664E-02 | 1,540E-02 | -4,44E-03 | 2,403E-02 | 7,416E-02 |
| PZ0017_UZ  | -3,85E-02 | -6,51E-02 | ,936      | -3,27E-02 | 8,688E-03 | -3,71E-02 | 2,314E-02 | 4,570E-02 | 6,463E-02 |
| PC0017_U   | -4,71E-02 | 2,424E-02 | ,932      | -5,77E-02 | 8,299E-02 | -4,04E-03 | -1,99E-02 | 4,257E-03 | 6,231E-02 |
| PZE6_UZ    | -5,39E-02 | ,177      | -6,43E-02 | ,875      | 2,674E-02 | -,155     | -1,34E-02 | -3,57E-03 | ,108      |
| PCE12_U    | ,215      | -,157     | 2,463E-02 | ,858      | 2,510E-02 | ,148      | ,120      | 2,133E-02 | -,157     |
| PZE12_UZ   | ,235      | -3,83E-02 | -,120     | ,846      | 5,570E-02 | -1,57E-02 | 7,613E-02 | -,182     | -4,06E-02 |
| PCE6_U     | -,148     | 2,297E-02 | 5,013E-02 | ,809      | -,109     | -2,09E-02 | -,160     | ,317      | -2,18E-02 |
| PC1824_U   | -,218     | ,354      | 9,271E-03 | -5,37E-02 | ,840      | 4,945E-02 | -,162     | -3,42E-02 | 3,217E-03 |
| PC0024     | -,219     | ,352      | ,101      | -5,18E-02 | ,836      | 6,375E-02 | -,159     | -3,68E-02 | 1,515E-02 |
| PC5099_U   | -,290     | -,133     | 1,851E-02 | -,174     | -,675     | 2,823E-02 | -8,00E-02 | -,208     | 9,131E-02 |
| PZ1824_UZ  | -,150     | ,501      | -3,41E-02 | -,122     | ,572      | 5,361E-02 | -5,20E-02 | ,306      | 6,058E-02 |
| PCVH_U     | 7,242E-02 | -5,40E-02 | -7,80E-02 | 7,294E-02 | -8,67E-02 | -,906     | ,140      | 7,000E-02 | -2,35E-02 |
| PZVH_UZ    | 5,178E-03 | -1,86E-02 | ,179      | -6,97E-02 | 8,231E-02 | -,822     | -,159     | 2,885E-02 | -,123     |
| PZ_U       | ,360      | 9,495E-03 | 6,960E-02 | -,128     | ,142      | ,520      | -,297     | ,242      | 5,839E-02 |
| PCZPS_U    | -8,36E-02 | -5,54E-02 | 4,883E-02 | 2,880E-02 | -,166     | 9,580E-02 | ,873      | ,176      | 5,429E-02 |
| PZZPS_UZ   | -,165     | -4,30E-03 | -3,65E-02 | -1,92E-02 | -1,31E-02 | -,190     | ,849      | -,282     | 8,744E-02 |
| PZ5099_UZ  | -7,72E-02 | -,107     | -,230     | -5,05E-02 | -,414     | -4,24E-02 | 5,124E-02 | -,710     | .123      |
| PZMLAE6_UZ | -8,93E-03 | -3,23E-02 | ,145      | -5,03E-03 | -3,29E-02 | 2,511E-02 | -2,44E-02 | -8,74E-02 | ,834      |
| PCMLAE6_U  | 2,446E-02 | -8,22E-02 | 9,562E-02 | -6,02E-02 | -3,50E-03 | ,145      | ,146      | 1,349E-02 | ,823      |

#### **Rotated Component Matrix**<sup>®</sup>

a. Rotation converged in 8 iterations.

#### fig. 1: Rotated matrix of factor loads – SPSS [1]

Finally, 3 factors were identified:

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 5 EURODIV 26.-27.1.2006 Milan, Italy.

Factor A – the young Factor B – poor education Factor C – the long-term unemployed

Next, the closest indicators to represent individual factors were selected - "The proportion of job applicants of the age group 0-24 years to the total number of job applicants" (PC0024\_U) for factor A, "The proportion of job applicants with basic education to the total number of job applicants" (PCVABC\_U) for factor B and "The proportion of job applicants registered for more than 12 months to the total number of job applicants" (PCE12 U) for factor C.

After expert evaluation, the set of indicators was extended by 2 additional indicators - unemployment rate (UR) and the proportion of job applicants over 50 years to the total number of job applicants (PC5099\_U).

On the basis of consultations, lower and upper limits were determined for the indicators that define the interval within which the development of values of individual indicators is probable (common in the given region and time), and that was used for standardisation (see table 3). As the minimum and the maximum value, the upper and the lower limit of indicators were then taken at standardisation.

|                  | UR [%] | PC0024_U [%] | PCVABC_U [%] | PCE12_U [%] | PC5099_U [%] |
|------------------|--------|--------------|--------------|-------------|--------------|
| Lower limit      | 0      | 0            | 0            | 0           | 0            |
| Upper limit      | 40     | 40           | 40           | 60          | 40           |
| Indication level | 20     | 40           | 30           | 50          | 35           |

If the indicator value is above the upper limit, we regard the situation to be very critical and the rate of criticality of 1 is assigned to the given record.

On the basis of consultations, for individual indicators the value of indication level was also determined; in case of higher values it is necessary to warn of the situation with the given indicator.

The matrices of the weights of pairs were prepared by experts.

The calculated set of weights was checked by the consistence ratio that was always 0.01 – so that models were considered to be consistent.

Further, the obtained result was consulted with experts and on the basis of this a compromise proposal of the matrix of pairwise comparison was worked out. On the basis of it, relevant weights were calculated.

The final indicator "criticality" A1 can be calculated as follows:

#### $A1 = 0.434*UR_{s} + 0.073*PC0024\_U_{s} + 0.062*PCVABC\_U_{s} + 0.278*PCE12\_U_{s} + 0.153*PC5099\_U_{s} (3)$

where URs is the standardised rate of unemployment,

 $PC0024_{U_s}$  is the standardised proportion of job applicants under 25 years to the total number of job applicants,

PCVABC\_Us is the standardised proportion of job applicants with basic education to the total number of job applicants,

 $PCE12\_U_s$  is the standardised proportion of job applicants registered for more than 1 year to the total number of job applicants,

PC5099\_Us is the standardised proportion of job applicants above 50 years to the total number of job applicants.

Further, choropleth maps describing the development of criticality indicator were produced and interpreted for the observed period.

The indicator of criticality A1 at the beginning and at the end of the observed period "copies" roughly the indicator UR. However, in the middle of the observed period it seems that the indicator A1 approximates, as far as its behaviour is concerned, more to the indicator PCE12\_U than the indicator UR. [1]

Similar evaluation was done for the whole MSK region.

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 6 EURODIV 26.-27.1.2006 Milan, Italy.

The achieved "criticality rate A1" in comparison with the rate of unemployment provides an image more smoothed and stable in time, where microregions characterised by a serious situation in the labour market may be delimited more easily. [2]



fig. 2 Rate of criticality of labour market situation in North Moravia and Silesia Region

## 2<sup>nd</sup> case study

For the 2<sup>nd</sup> case study, more complex set of descriptors was selected. Data describes the period 1998-2002 for 2 districts of the Czech Republic.

Set of descriptors covers unemployment level, structure, demographical and geographical factors:

- ZPCVABC\_U is the standardised proportion of job applicants with basic education to the total number of job applicants,
- ZM is the standardised rate of unemployment,
- ZPCE12\_U is the standardised proportion of job applicants registered for more than 1 year to the total number of job applicants,
- ZPPSS is the standardised proportion of natural increment 1998-2002 to medium population,
- ZRPML is the standardised proportion of children (0-14 years) to the total population,
- ZPC5099\_U is the standardised proportion of job applicants above 50 years to the total number of job applicants,
- ZMPSS is the standardised proportion of migration increment of population 1998-2002 to the 1000 residents

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 7 EURODIV 26.-27.1.2006 Milan, Italy.

- ZPC0024 U is the standardised proportion of job applicants under 25 years to the total number of • job applicants,
- ZVYJEA is the is the standardised proportion of commuting (driving out for job) residents 1998-2002 to the economic active population
- ZPPMEA is the standardised proportion of new registered job vacancies to the economic active • population.

|           |       | Component |      |
|-----------|-------|-----------|------|
|           | 1     | 2         | 3    |
| Zpcvabc u | .752  | .425      |      |
| Zmn       | ,744  | ,317      |      |
| ZVYJEA    | 695   |           | .368 |
| ZRPML     | .580  | 346       | .384 |
| ZMPSS     | 349   |           |      |
| ZPPMEA    |       | 632       | 631  |
| Zpc5099 u |       | .614      | 393  |
| Zpce12 u  | .369  | .592      |      |
| ZPPSS     | .529  | 544       |      |
| Zpc0024 u | - 520 |           | 584  |

#### Component Matrix <sup>a</sup>

Extraction Method: Principal Component Analysis.

a. 3 components extracted.

#### fig. 3 Component matrix

|           |      | Component |      |
|-----------|------|-----------|------|
|           | 1    | 2         | 3    |
| Zpcvabc u | .784 |           | 336  |
| Zmn       | .721 |           |      |
| Zpce12 u  | .709 |           |      |
| ZPPSS     |      | .785      |      |
| ZRPML     |      | .740      |      |
| Zpc5099 u |      | 733       |      |
| ZMPSS     |      | 343       |      |
| Zpc0024 u |      |           | .750 |
| ZVYJEA    |      |           | .709 |
| ZPPMEA    | 599  |           | 647  |

#### а **Rotated Component Matrix**

Extraction Method: Principal Component Analysis. Rotation Method: Varimax with Kaiser Normalization.

a. Rotation converged in 5 iterations.

#### fig. 4 Rotated component matrix

Following factors were identified [4]:

F1 - unsatisfied labour close correlated with insufficient education, higher unemployment rate and long-term unemployment. It indicates position one of the most critical group of unemployed people.

Sedenkova, M., Horak, J.: Multivariable and multicriteria evaluation of labour market situation. Conference 8 EURODIV 26.-27.1.2006 Milan, Italy.

*F2* – demographical factor, consisting of:

- potential of future labour force
- potential of future labour force of young people
- older applicants
- lost of labour force due to the depopulation of municipalities

F3 – migration to work, covering:

- unutilised young labour force
- dependency of residents to commute to other centres
- potential of labour force in commuting centre.

Results of the factor analysis were used for deeper study of the labour market situation and regionalisation of the territory. The detection of municipalities, which deviate from common situation, is obvious from following figures.



fig. 5 Outliers indicated for each factor [4]



fig. 6 Result of K-means clustering [4]

#### Conclusion

In the last years, the Central and Eastern European countries have undergone great economical and political changes. In all transformed countries it is labour markets that represent one of serious problems manifesting themselves in an increase in unemployment as a result of changes in the structure of national economies. Primarily an increase in long-term unemployment seems to be alarming. Considerable regional and microregional differences constitute another serious problem of labour markets in individual countries.

In the framework of the examination and assessment of conditions and developments of regional labour markets, a need often appears to describe and evaluate the situation in local labour markets, i.e. to focus attention on the level of municipalities, or small territorial units, so-called microregions. The traditional evaluation of the labour market situation merely on the basis of unemployment rate does not describe well differences between individual regions.

The more comprehensive procedure can follow these steps:

- 1. collection of wider range of descriptors
- 2. multivariate analysis
- 3. selection of most significant indicators suitable for evaluation of labour market situation
- 4. multicriteria evaluation of selected indicators

Examples of utilisation of such approach are given for North Moravia and Silesia Region, where the situation is studied since 1998 with these tools.

#### References

- [1] Boroň, M., Hančlová, J., Horák, J., Horáková B., Šimek M.: Multivariační a multikriteriální hodnocení nezaměstnanosti. (Multivariate and Multicriteria valuation of Unemployment). [CD-ROM] In Proceedings of the conference GIS Seč 2003 11.-13.6.2003, Seč, 2003, 17 p.
- [2] Horák J., Horáková B., Šimek M.: EXAMPLES OF GEOINFORMATION TECHNOLOGY USE IN LABOUR MARKET ANALYSES. IN The Czech Geography at the Dawn of the Millennium, pp. 391-410, Olomouc 2004. ISBN 80-244-0858-9.
- [3] Hančlová J., Horák J., Šimek M.: Local Labour Markets Classification in the Moravia-Silesia Region. In Proceedings of the International Conference Quantitative Methods in Economics (Multiple Criteria Decision Making XII). Virt, 2.-4.6.2004, Slovak republic. ISBN 80-8078-012-9. pp. 61-70.
- [4] Hančlová J., Horák J., Šimek M.: Využití multivariačních metod v analýzách regionálních trhů práce (Application of multivariate methods in regional labour market analysis). VŠB-TU Ostrava, 2005, 110 pages. ISBN: 80-248-0691-6.
- [5] Horak J., Sedenkova M.: Traffic Accessibility Evaluation. Evaluation with Examples of Employers Accessibility. In proceedings of 14TH European Colloquium on Theoretical and Quantitative Geography, 9-13.9. 2005, Tomar, Portugal, 14 p. ISBN 972-98309-8-3.
- [6] Saaty, T.: A scaling Method for Priorities in Hierarchical Structures. *Journal of Math. Psychology*, 15, 1977, p.234-281.

### NOTE DI LAVORO DELLA FONDAZIONE ENI ENRICO MATTEI

#### Fondazione Eni Enrico Mattei Working Paper Series

Our Note di Lavoro are available on the Internet at the following addresses:

http://www.feem.it/Feem/Pub/Publications/WPapers/default.html

http://www.ssrn.com/link/feem.html

http://www.repec.org

http://agecon.lib.umn.edu

#### NOTE DI LAVORO PUBLISHED IN 2006

| SIEV         | 1.2006  | Anna ALBERINI: Determinants and Effects on Property Values of Participation in Voluntary Cleanup Programs:  |
|--------------|---------|---|
| CCMD         | 2 2006  | <u>The Case of Colorado</u><br>Valentina BOSETTI, Carlo CARRARO and Marzio GALEOTTI: <u>Stabilisation Targets</u> , <u>Technical Change and the</u>   |
| CUMP         | 2.2000  | Macroeconomic Costs of Climate Change Control   |
| CCMP         | 3.2006  | Roberto ROSON: Introducing Imperfect Competition in CGE Models: Technical Aspects and Implications  |
| KTHC         | 4.2006  | Sergio VERGALLI: The Role of Community in Migration Dynamics  |
| SIEV         | 5.2006  | <i>Fabio GRAZI, Jeroen C.J.M. van den BERGH and Piet RIETVELD</i> : <u>Modeling Spatial Sustainability: Spatial</u><br>Welfare Economics versus Ecological Footprint  |
| ССМР         | 6.2006  | Olivier DESCHENES and Michael GREENSTONE: <u>The Economic Impacts of Climate Change: Evidence from</u><br>Agricultural Profits and Random Eluctuations in Weather   |
| PRCG         | 7.2006  | Michele MORETTO and Paola VALBONESE: Firm Regulation and Profit-Sharing: A Real Option Approach   |
| SIEV         | 8.2006  | Anna ALBERINI and Aline CHIABAI: Discount Rates in Risk v. Money and Money v. Money Tradeoffs   |
| CTN          | 9.2006  | Jon X. EGUIA: United We Vote  |
| CTN          | 10.2006 | Shao CHIN SUNG and Dinko DIMITRO: A Taxonomy of Myopic Stability Concepts for Hedonic Games   |
| NRM          | 11.2006 | Fabio CERINA (lxxviii): Tourism Specialization and Sustainability: A Long-Run Policy Analysis   |
| NRM          | 12.2006 | Valentina BOSETTI, Mariaester CASSINELLI and Alessandro LANZA (Ixxviii): <u>Benchmarking in Tourism</u><br>Destination Keeping in Mind the Sustainable Paradiam   |
| CCMP         | 13 2006 | Loss HORB4CH: Determinants of Environmental Innovation – New Evidence from German Panel Data Sources  |
| KTHC         | 14 2006 | <i>Fabio SABATINI: Social Canital Public Spending and the Quality of Fednomic Development: The Case of Italy</i>  |
| KTHC         | 15 2006 | <i>Fabio SABATINI</i> : The Empirics of Social Canital and Economic Development: A Critical Perspective   |
| CSRM         | 16 2006 | <i>Fuolo SADATINI</i> . <u>The Empirics of Social Capital and Economic Development</u> . A Citical Feispective  |
| CSIGN        | 10.2000 | Pab R DEFLINK and Marian W HOEKES: The Timing of National Greenbause Gas Emission Reductions in   |
| CCMP         | 17.2006 | the Presence of Other Environmental Policies  |
| IEM          | 18 2006 | In the second of One Environmental Impacts of Energy Efficiency Cartificates Vs. Taxes and Standards  |
| CTN          | 10.2000 | Someda LAUIDA. A Walk Dargaining Set for Contract Chains Problems   |
| CIN          | 19.2000 | Some Diaming and Weak Darganing Set for Contract Context Problems   |
| CCMP         | 20.2006 | Innovations   |
| SIEV         | 21 2006 | <u>IIIIIOVALIOUS</u><br>V. Hossain FARZIN and Kan ICHI AKAO: Non necuniary Work Incentive and Labor Supply  |
| SILV         | 21.2000 | 1. HOSSEN FARZIN and KENCHI HARAO. <u>MOIPPECUMUNIX NECENTRE and Labor Suppry</u>   |
| CCMP         | 22.2006 | Multionantel II, Multeo MANERA and Alessandro LANZA. On the Robustness of Robustness Checks of the  |
| NDM          | 22 2006 | Environmental Ruzhets Curve   |
|              | 23.2000 | V. Hossein FARZIN and Kentern ARAO. WHEN IS IT Optimate to Exhibit a Resource in a Finite Time from a second a second and the |
| NRM          | 24.2006 | Extinction  |
| SIEV         | 25.2006 | Lucia VERGANO and Paulo A.L.D. NUNES: Analysis and Evaluation of Ecosystem Resilience: An Economic<br>Perspective   |
| SIEV         | 26.2006 | Danny CAMPBELL, W. George HUTCHINSON and Riccardo SCARPA: Using Discrete Choice Experiments to<br>Derive Individual-Specific WTP Estimates for Landscape Improvements under Agri-Environmental Schemes<br>Evidence from the Rural Environment Protection Scheme in Ireland  |
| KTHC         | 27.2006 | <i>Vincent M. OTTO, Timo KUOSMANEN and Ekko C. van IERLAND</i> : Estimating Feedback Effect in Technical Change: A Frontier Approach  |
| CCMP         | 28.2006 | <i>Giovanni BELLA</i> : Uniqueness and Indeterminacy of Equilibria in a Model with Polluting Emissions  |
| IEM          | 29.2006 | Alessandro COLOGNI and Matteo MANERA: The Asymmetric Effects of Oil Shocks on Output Growth: A  |
| VTUC         | 20.2000 | Markov-Switching Analysis for the G-7 Countries   |
| KIHC<br>ET A | 30.2006 | <i>Fablo SABATINI</i> : Social Capital and Labour Productivity in many  |
| EIA          | 31.2006 | Andrea GALLICE (IXXIX): Predicting one Shot Play in 222 Games Using Beilers Based on Minimax Regret   |
| IEM          | 32.2006 | Route from the Black Sea to Italy   |
| NRM          | 33 2006 | Rinaldo BRAU and Davide CAO (Ixxviii): Uncovering the Macrostructure of Tourists' Preferences. A Choice   |
| I VINIVI     | 55.2000 | Experiment Analysis of Tourism Demand to Sardinia   |
| CTN 24       | 34 2006 | Parkash CHANDER and Henry TULKENS: Cooperation, Stability and Self-Enforcement in International   |
| CIN          | 54.2000 | Environmental Agreements: A Conceptual Discussion   |
| IEM          | 35.2006 | Valeria COSTANTINI and Salvatore MONNI: Environment, Human Development and Economic Growth  |
| ETA          | 36.2006 | Ariel RUBINSTEIN (lxxix): Instinctive and Cognitive Reasoning: A Study of Response Times  |

| ETA    | 37.2006 | Maria SALGADO (lxxix): Choosing to Have Less Choice  |
|--------|---------|--|
| FTΔ    | 38 2006 | Justina A.V. FISCHER and Benno TORGLER: Does Envy Destroy Social Fundamentals? The Impact of Relative  |
| LIA    | 58.2000 | Income Position on Social Capital  |
| ETA    | 39 2006 | Benno TORGLER, Sascha L. SCHMIDT and Bruno S. FREY: Relative Income Position and Performance: An   |
| 2111   | 27.2000 | Empirical Panel Analysis   |
| CCMP   | 40 2006 | Alberto GAGO, Xavier LABANDEIRA, Fidel PICOS And Miguel RODRIGUEZ: <u>Taxing Tourism In Spain</u> :  |
|        |         | Results and Recommendations  |
| IEM    | 41.2006 | Karl van BIERVLIET, Dirk Le ROY and Paulo A.L.D. NUNES: An Accidental Oil Spill Along the Belgian  |
| CCMD   | 12 2006 | Coast: Kesults from a CV Study<br>Rel(COLOMREK and Michael HOEL: Endegenous Technology and Tradeble Emission Quetes  |
| CUMP   | 42.2000 | <i>Ciulio CAINELLI and Donato IACOBUCCI:</i> The Pole of Agglomeration and Technology in Shaping Firm  |
| KTHC   | 43.2006 | Strategy and Organization  |
|        |         | Alvaro CALZADILLA Francesco PALILL and Roberto ROSON: Climate Change and Extreme Events: An  |
| CCMP   | 44.2006 | Assessment of Economic Implications  |
|        |         | ME KRAGT PC ROEBELING and A RULIS Effects of Great Barrier Reef Degradation on Recreational  |
| SIEV   | 45.2006 | Demand: A Contingent Behaviour Approach  |
|        | 46.0006 | C. GIUPPONI, R. CAMERA, A. FASSIO, A. LASUT, J. MYSIAK and A. SGOBBI: Network Analysis, Creative   |
| NRM    | 46.2006 | System Modelling and DecisionSupport: The NetSyMoD Approach  |
| VTIO   | 47.0000 | Walter F. LALICH (lxxx): Measurement and Spatial Effects of the Immigrant Created Cultural Diversity in  |
| KTHC   | 47.2006 | Sydney   |
| KTHC   | 48.2006 | Elena PASPALANOVA (lxxx): Cultural Diversity Determining the Memory of a Controversial Social Event  |
| KTHC   | 19 2006 | Ugo GASPARINO, Barbara DEL CORPO and Dino PINELLI (lxxx): Perceived Diversity of Complex   |
| KIIIC  | 49.2000 | Environmental Systems: Multidimensional Measurement and Synthetic Indicators   |
| КТНС   | 50 2006 | Aleksandra HAUKE (lxxx): Impact of Cultural Differences on Knowledge Transfer in British, Hungarian and  |
| KIIIC  | 50.2000 | Polish Enterprises   |
| KTHC   | 51.2006 | Katherine MARQUAND FORSYTH and Vanja M. K. STENIUS (lxxx): The Challenges of Data Comparison and   |
|        |         | Varied European Concepts of Diversity  |
| KTHC   | 52.2006 | Gianmarco I.P. OTTAVIANO and Giovanni PERI (IXXX): <u>Rethinking the Gains from Immigration: Theory and</u>  |
| VTUC   | 52 2006 | Evidence from the U.S.<br>Maniag PARNU (hump): From Statistical to Coolinguistic Date: Manning and Macqueing Linguistic Diversity.   |
| KTHC   | 54.2000 | <i>Monica DARIM</i> (IXXX). <u>From Statistical to Geomiguistic Data. Mapping and Measuring Linguistic Diversity</u>   |
| KIHC   | 54.2006 | Each $TASOET and Each DE DENEDICTIS (TXX). Economic integration and Similarity in Trade Studentes$   |
| KTHC   | 55.2006 | Suzanna CHAIV (IXXX): God s Little Acre and Belfast Chinatown : Diversity and Ethnic Place Identity in   |
| VTUO   | 5( 200( | Bellasi  |
| KIHC   | 56.2006 | $\frac{1}{1} = \frac{1}{1} $ |
| KTHC   | 57.2006 | John J. BETANCUR (IXXX): From Outsiders to On-Paper Equals to Cultural Curiosities? The Trajectory of  |
| VTIO   | 50 0000 | <u>Diversity in the USA</u>  |
| KTHC   | 58.2006 | Kijiemariam HAMDE (IXXX): <u>Cultural Diversity A Glimpse Over the Current Debate in Sweden</u>  |
| KTHC   | 59.2006 | Emilio GREGORI (Ixxx): Indicators of Migrants' Socio-Professional Integration  |
| КТНС   | 60 2006 | Christa-Maria LERM HAYES (lxxx): Unity in Diversity Through Art? Joseph Beuys' Models of Cultural  |
| Rine   | 00.2000 | <u>Dialogue</u>  |
| KTHC   | 61.2006 | Sara VERTOMMEN and Albert MARTENS (Ixxx): Ethnic Minorities Rewarded: Ethnostratification on the Wage  |
|        |         | Market in Belgium  |
| KTHC   | 62.2006 | Nicola GENOVESE and Maria Grazia LA SPADA (Ixxx): <u>Diversity and Pluralism: An Economist's View</u>  |
| KTHC   | 63.2006 | Carla BAGNA (Ixxx): Italian Schools and New Linguistic Minorities: Nationality Vs. Plurilingualism. Which  |
| VTUC   | (1 200) | <u>Ways and Methodologies for Mapping these Contexts?</u>  |
| KIHC   | 04.2000 | <i>Vedran OMANOVIC</i> (IXXX): <u>Understanding</u> Diversity in Organizations Paradigmatically and Methodologically<br>Mila PASPALANOVA (IXXX): Identifying and Assessing the Development of Repulsions of Undecumented   |
| KTHC   | 65.2006 | Minu 1 ADI ALANOVA (IAAA). Identifying and Assessing the Development of ropulations of Undocumented<br>Migrants: The Case of Undocumented Poles and Bulgarians in Brussals   |
| КТНС   | 66 2006 | Roberto ALZETTA (Ixxx): Diversities in Diversity: Exploring Moroccan Migrants' Livelihood in Genoa   |
| IXTITC | 00.2000 | Monika SEDENKOVA and Jiri HORAK (lxxx): Multivariate and Multicriteria Evaluation of Labour Market   |
| КТНС   | 67.2006 | Situation  |
|        |         |  |

(lxxviii) This paper was presented at the Second International Conference on "Tourism and Sustainable Economic Development - Macro and Micro Economic Issues" jointly organised by CRENoS (Università di Cagliari and Sassari, Italy) and Fondazione Eni Enrico Mattei, Italy, and supported by the World Bank, Chia, Italy, 16-17 September 2005.

(lxxix) This paper was presented at the International Workshop on "Economic Theory and Experimental Economics" jointly organised by SET (Center for advanced Studies in Economic Theory, University of Milano-Bicocca) and Fondazione Eni Enrico Mattei, Italy, Milan, 20-23 November 2005. The Workshop was co-sponsored by CISEPS (Center for Interdisciplinary Studies in Economics and Social Sciences, University of Milan-Bicocca).

(lxxx) This paper was presented at the First EURODIV Conference "Understanding diversity: Mapping and measuring", held in Milan on 26-27 January 2006 and supported by the Marie Curie Series of Conferences "Cultural Diversity in Europe: a Series of Conferences.

|      | 2006 SERIES   |
|------|---|
| ССМР | Climate Change Modelling and Policy (Editor: Marzio Galeotti)                     |
| SIEV | Sustainability Indicators and Environmental Valuation (Editor: Anna Alberini)     |
| NRM  | Natural Resources Management (Editor: Carlo Giupponi)                             |
| КТНС | Knowledge, Technology, Human Capital (Editor: Gianmarco Ottaviano)                |
| IEM  | International Energy Markets (Editor: Anil Markandya)                             |
| CSRM | Corporate Social Responsibility and Sustainable Management (Editor: Sabina Ratti) |
| PRCG | Privatisation Regulation Corporate Governance (Editor: Bernardo Bortolotti)       |
| ЕТА  | Economic Theory and Applications (Editor: Carlo Carraro)                          |
| CTN  | Coalition Theory Network  |