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## Analyzing and prioritization of HSE performance evaluation measures utilizing Fuzzy ANP (Case studies: Iran Khodro and Tabriz Petrochemical)

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### Abstract

Today, HSE (health, safety, and environment) systems play a vital role in green and sustainable aspects of the companies. However, performance evaluation of HSE systems is a crucial issue in industry and academia. This paper tries to identify and prioritize the effective factors in HSE performance in Iran Khodro (the largest automotive company in Iran) and Tabriz Petrochemical (one of the biggest Iranian petrochemical company). The factors are achieved through the literature and recent publications and then they are customized by the expert's opinions. Finally, a hybrid Fuzzy DEMATEL ANP approach is developed for prioritization of the factors. Indeed, Fuzzy DEMATEL is used in order to determine the relations among factors and sub factors and to help in providing ANP super matrix. Afterward, the Fuzzy ANP is proposed to find the final weights of the factors and sub factors. The weights are used in order to prioritize the factors for two selected companies.

**Keywords:** HSE; Performance evaluation; Factors and Sub factors; Fuzzy DEMATEL; Fuzzy ANP.

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### 1. Introduction

Safety is an absolutely relative but normative for any organization. This phrase is generally defined as "the condition of being safe from undergoing or causing hurt, injury, or loss". Today, rarely we can find a work environment where the HSE system is not implemented (Robson and Bigelow, 2010). The HSE system included various aspects related to health and safety management (Bacchetta, 2009). Regarding current popular measures in order to evaluate occupational health and safety management, AFR (Accident Frequency Rate) and ASR (Accident Severity Rate) are the most important ones (OSHA, 2007). The mentioned

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measures are quantitative, specific, and cannot be biasedly judged. Similar to other measures, they need a comprehensive recording system. Besides, the roots of the accidents are not known and we just have some statistics about the happenings. We cannot understand if an accident is happened based on the lack of training system and competencies or the weaknesses of the risk management system.

The other proposed approach of evaluating HSE system is implementation an effective auditing process. The audits would be performed based on the standards and regulations (Manuele, 2007). The auditing processes compare the situation of the HSE system with the acceptable point (the minimum level of the requirements). The system is checked with the requirements and the nonconformities are reported in order to set corrective actions (Su et al., 2005). Some auditing tools are for general work environments and some are completely special (Bigelow and Robson, 2005). Occupational Health and Safety Management System (OHSMS), and Occupational Health & Safety (OHSAS) Audit tool are two of the best (Redinger and Levine, 1999).

Recently, the growing interest of performance evaluation of HSE (health, safety, and environment) systems can be seen in industries. The reports of International Labor Organization (ILO) emphasize that around 4% of countries GDP are spent in occupational and health accidents (Sarmad nahri 2008). Therefore, one of the most important things of the industries is continuous improvement of HSE systems. However, in any improvement, identifying the measures and factors in order to evaluate the performance of HSE systems is absolutely significant. Each day, thousands of occupational accidents are happened around the world because of the labors' faults, defected machines, inappropriate warehousing, and other potential risks. When the accidents happen, the fact-finding teams start to analyze the accident, find the cause(s), and perform correcting actions in order to prevent other similar happenings. Then the related statistics are created based on the data analyses. The mentioned process is really expensive with irreparable results such as death and deep injuries.

On the other hand, preventive actions are identified as the best ways of decreasing the human and financial costs of the occupational accidents. Consequently, improving the capabilities of an HSE system would lead to dramatically falling down the side effects of the injuries including economic, human, and social damages. Finally, the issue of evaluation of an HSE system is the basic step of any improvement and preventive action. Indeed, the backbone of the control and improvement in any system such as HSE system is planning an appropriate performance evaluation structure (Beriha et al., 2011).

The next step in evaluating the performance of HSE system is to provide several adequate qualitative and quantitative measures. This is an absolutely crucial step in planning an effective evaluation system. American National Standards Institute (ANSI) suggests the frequencies of death and Injury-related disability as strong measures (NOROZI et al., 2015).

Each year, various research institutes and governmental organizations study on the occupational injuries. International Labor Organization (ILO) reports 120 millions of work accidents in which 120 thousands of them are significant and tragedy (Sarmad nahri 2008). In spite of these facts, still we can monitor thousands of the easy-to-prevent accidents in industries their disastrous side effects. Besides, the development of industries and the vast usage of machines and tolls preserve the issue of improvement of HSE system completely vital.

This paper tries to identify the measures of evaluating HSE system through literature and then customize them by industrial experts of two of the largest companies in Iran (one in

automotive and the other in petrochemical industry). The reasons of selecting the mentioned two manufacturers are twofold: the number of workers and the importance and statistics of the accidents. More than 60 thousand employees are working in Iran Khodro Company (IKCO) and from this aspect it is the largest company in Iran. On the other hand, petrochemical companies have the highest reports of the work accidents in Iran with 12 accidents a day for 2016. Thus, Tabriz Petrochemical Company (TPC) is also selected as the representor of these types of industries. Exploiting the experts of the mentioned selected companies, the prioritization of the HSE evaluation system is undertaken in this research.

The rest of this paper is organized as follows: In Section 2, an appropriate literature review is discussed to find the current gaps. The backbone techniques of the study are presented in Section 3. Section 4 explains the methodology of the research. Results and discussions for Fuzzy DEMATEL and Fuzzy ANP are presented in Sections 5 and 6 respectively. Finally, conclusion, and suggestions for future research are presented in Section 7.

## **2. Literature review**

Arabzadeh (2012) utilized a Job Safety Analysis (JSA) method in order to identify, evaluate (qualitatively), and controlling the risks of a leather company in Iran (Arabzadeh 2012). The same method is used in a tunnel construction of a water plant regarding OSHA 3071 by Barkhordari (2012). Both of the mentioned researches utilized MIL-STD-882E in order to assign the acceptable level of risk. Razavi 2015, tried to evaluate the HSE level in Pars petrochemical complex utilizing JSA through several site visits and interviews. Murè and Demichela (2009) developed a Fuzzy-based procedure to quantify the risk of occupational accidents in a steel industry.

There are recent publications which are employed Multi-Attribute Decision Making (MADM) tools. Ng et al. (2010) investigated the epidemiology of patients of 196 severed-type of accidents between January 2006 and December 2007 in a single institution in Singapore. They could find that the most common cause of injury is fall from height with 66.3%. Chinese and Indian workers are on the top list of the most injured. They proposed the lack of training and mismanagement as the main factors which cause accidents. Arezes and Miguel (2003) compared the traditional indicators of health and safety performance with the potential role of safety culture in industries. Beriha et al. (2011) portrayed a benchmark occupational health and safety performance in industries employed Data envelopment analysis (DEA) as a robust mathematical evaluation tool regarding 30 Indian organizations. Similar to the mentioned paper, Shirooyezadeh (2011) exploits AHP/DEA approach in evaluating the safety level of a gas refinery in Assalouyeh oil and gas zone as the most important region of plants and refineries in Iran (Shirooyezadeh, 2011).

Recently, Mohammadi and Iranban (2015) studied the role of integrated management system on hospitals efficiency using the Balanced Scorecard (BSC) and DEA/AHP. They tried to evaluate the HSE system through the developed approach. Wu et al. (2015) analyzed the effectiveness of maritime safety control along the Yangtze River regarding navigational environments utilizing a DEA-based model. Chang et al. (2015) concentrated on evaluation of safety risk management, safety policy and objectives, safety promotion, and safety assurance of Taiwan's Taoyuan, Kaohsiung, and Taipei Songshan international airports using Analytic Network Process (ANP) for weighting and Fuzzy Technique of Ordering Preference by Similarity to Ideal Solution (TOPSIS) for ranking the mentioned airports.

The summarization of the literature is illustrated in Table 1 in order to have a structured view of the earlier studies and the role of this paper in the literature:

**Table 1. The summarization of the earlier studies**

| Publication                  | Problem                    | Case study                                       | Method                  |
|------------------------------|----------------------------|--|-------------------------|
| Arabzadeh (2012)             | Risk management            | Leather company                                  | JSA                     |
| Barkhordari (2012)           | Risk management            | Tunnel construction of a water plant             | JSA                     |
| Razavi (2015)                | HSE evaluation             | Pars petrochemical complex                       | JSA                     |
| Murè and Demichela (2009)    | Risk management            | Steel industry                                   | Fuzzy-based procedure   |
| Ng et al. (2010)             | Accidents analysis         | An institution in Singapore                      | Survey                  |
| Arezes and Miguel (2003)     | HSE evaluation             | Several industries                               | Survey                  |
| Beriha et al. (2011)         | HSE evaluation             | 30 Indian organizations                          | DEA                     |
| Shirooyezadeh (2011)         | HSE evaluation             | Gas refinery                                     | AHP-DEA                 |
| Mohammadi and Iranban (2015) | HSE evaluation             | Hospitals  | BSC-DEA-AHP             |
| Wu et al. (2015)             | Maritime safety control    | Maritime safety control                          | DEA                     |
| Chang et al. (2015)          | Risk and safety evaluation | Taiwan's Taoyuan, Kaohsiung, and Taipei Songshan | ANP-TOPSIS              |
| This paper                   | HSE evaluation             | Automotive and petrochemical                     | Fuzzy DEMATEL-Fuzzy ANP |

According to the content of Table 1, it is clear that HSE evaluation problem is a matter of concern in various industries but the necessity of new approaches such as Fuzzy DEMATEL and Fuzzy ANP can be clearly seen. Therefore, two popular companies from two different industries (one in automotive and one in petrochemical) are selected for evaluating a new Fuzzy DEMATEL ANP approach for HSE evaluation.

Analyzing the abovementioned literature clarifies the following crucial points:

- The HSE evaluation system is really significant in various types of industries and in this paper two of the most critical industries are selected to be investigated.
- Developing new and effective approaches in evaluating the HSE systems is absolutely necessary specially the approaches which can regard expert opinions such as MADM approaches. Therefore, in this paper, a new Fuzzy DEMATEL-ANP approach is developed in order to find the relations and assign the weights.

### 3. The backbone techniques of the study

In order to provide a framework for HSE evaluation system a three-stage approach is proposed in this study. First, through a deep literature survey, the appropriate criteria and sub criteria are achieved and then in the second step, the relations of the criteria and sub criteria are investigated through several experts and special questioners. The results of the first two steps lead us to a network of criteria and sub criteria. Finally, the appropriate paired comparison analysis is undertaken using ANP approach and the experts. In the following, the detail structure of the analysis is explained.

### 3.1. Fuzzy DEMATEL

DEMATEL is an effective paired comparison MADM method which was introduced in 1972 by Gabus and Fontela (Gabus and Fontela, 1972). The technique is based on the experts' opinions and graph theory. In a directed graph, we can distinguish cause and effect types of nodes based on analyzing the bidirectional graph. At last, a structure of impacts between factors would be achieved from the analyses of DEMATEL. This technique is used in this paper based on the following reasons:

- The identified criteria and sub criteria of the study are not independent to each other so that some methods such as AHP cannot be utilized. Consequently, an effective method is needed to analyze the impact and based on the historical performance; DEMATEL is selected as a preliminary step of ANP.
- Analyzing the cause and effects by the experts could spot more lights on the subject of paired comparison. Furthermore, the precisions and quality of the judgments in ANP would be significantly elevated. This claim can be proved through investigating the inconsistencies of ANP.
- The classical DEMATEL do not consider the uncertainties of the real world in judgments. In fact, the crisp types of paired comparisons are not advised in real-world environments. Finally, a Fuzzy DEMATEL is developed in this paper.

### 3.2. Fuzzy ANP

The analytic network process is a general version of the analytic hierarchy process. While AHP structures the alternatives, criteria, and sub criteria into a hierarchical form, ANP structures the problem as a network. Both ANP and AHP obey the pairwise comparisons rules in order to achieve the weights and ranks (Saati, 2001 and Saati, 2005). The networks of an ANP consist of several interconnected clusters with outer and inner dependencies and each cluster contains some criteria and sub criteria. The network is similar to a directed graph in which the directions come from a preliminary step in ANP or other professional methods such as DEMATEL (as is in this study). Since, regarding uncertainties in risk-type of issues such as accidents is vital, again Fuzzy ANP is developed for this paper to cover the lack of crisp judgments.

### 3.3. Statistical population

In this study, two companies from two different sectors (one in automotive and the other in petrochemical) are selected. As the largest automotive producers in Middle-East, IKCO does have much of a role to play in the areas associated with HSE. Besides, TPC is one of the largest petrochemical companies in Iran where many special health, safety, and environmental aspects should be critically implemented and monitored. On the other hand, in terms of number of labors, IKCO is the most significant producer in Iran and from the potential hazards; TPC is one of the most influential manufacturers in Iran.

The pairwise comparisons are performed through a group of 16 and 30 HSE experts for IKCO and TPC respectively (totally 46 experts). The experts are the educated (at least BSc), experienced (more than 5 years HSE-related experience) managers from top-chart of two companies.

#### 4. The methodology of the research

The complete methodology of the research is illustrated graphically in Figure 1.

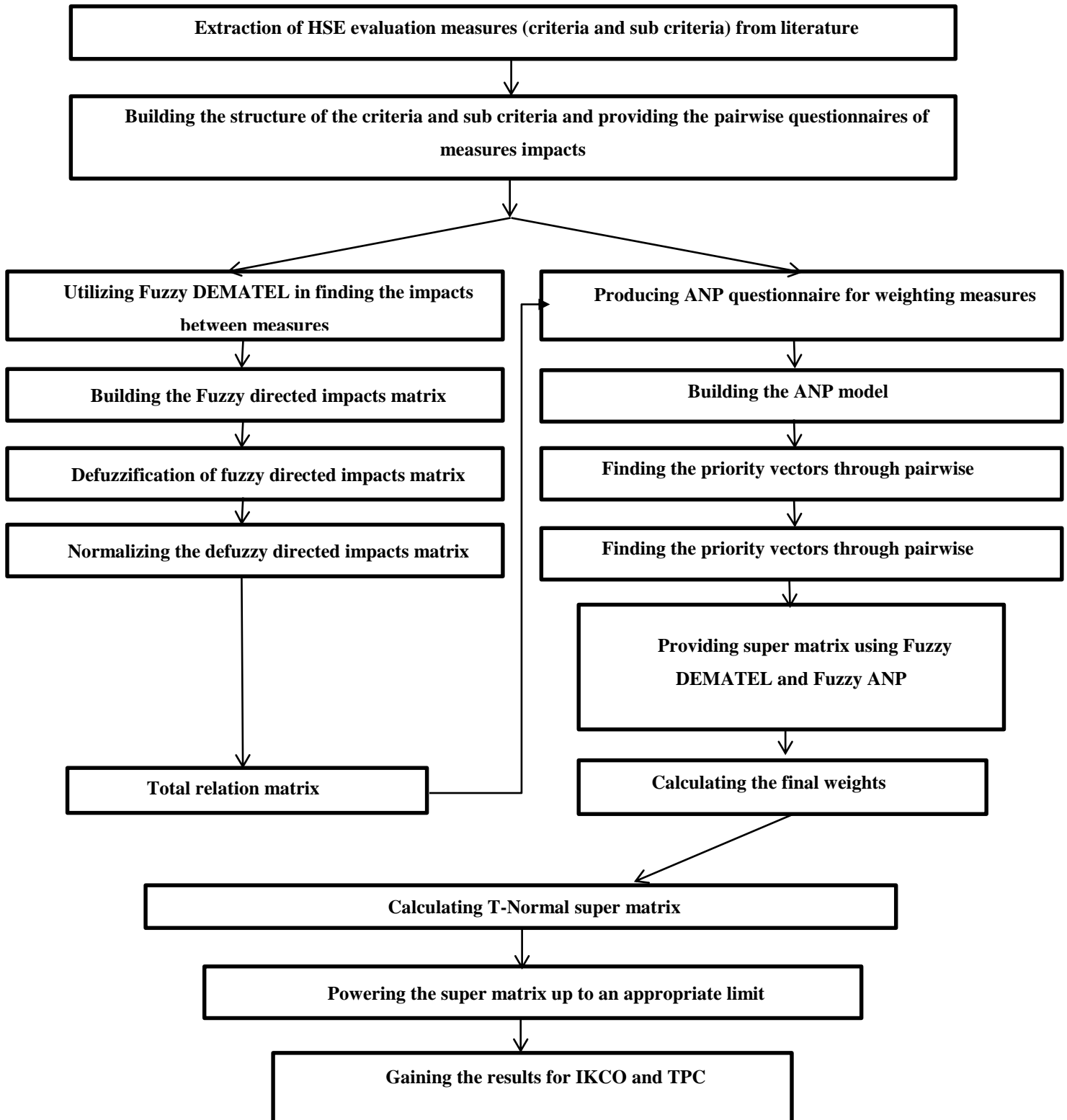


Figure 1. The methodology of the Fuzzy-DEMATEL-ANP approach of this research

Based on Figure 1, the proposed approach of evaluating HSE measures consists of two main steps. Firstly, Fuzzy DEMATEL is analyzed for the criteria and sub criteria through appropriate pairwise comparisons and the cause and effect relations are achieved. Secondly, the results of DEMATEL are used in order to provide ANP super matrix and then Fuzzy ANP is progressed by the experts to find the weights of all measures. These weights are utilized in the process of HSE evaluations in two case studies: Iran Khodro Company (the sight of Tehran) and Tabriz Petrochemical Company.

On the other hand, the selected criteria and sub criteria of the research are illustrated in Table 2.

**Table 2. The criteria and sub criteria of the study**

| Major criteria               | The Code | Sub-criteria   | The Code |
|------------------------------|----------|--|----------|
| Harmful Factors in Workplace | C1       | Physical environment of workplace such as noise, light, etc.                     | C11      |
|                              |          | Chemical factors such as steam, smoke, heat, cold, vibration                     | C12      |
|                              |          | Ergonomic factors  | C13      |
|                              |          | Psychological factors such as job stress, quarrel, strike of employees and so on | C14      |
|                              |          | Biological factors such as bacteria, parasite, fungus, etc.                      | C15      |
| Immunity Indicators          | C2       | Electricity immunity   | C21      |
|                              |          | Fire immunity  | C22      |
|                              |          | Individual protection immunity (use of shoes, hat, gloves, mask, uniforms, etc.  | C23      |
|                              |          | Immunity of equipment and tools  | C24      |
|                              |          | Furnishing   | C25      |
|                              |          | Teaching immunity to employees such as first aids                                | C26      |
|                              |          | Risk management program in organization  | C27      |
| Environmental Indicators     | C3       | Environmental evaluation   | C31      |
|                              |          | Energy consumption per capita  | C32      |
|                              |          | Energy auditing studies  | C33      |
|                              |          | Prevention of energy wasting   | C34      |
|                              |          | Water consumption per capita   | C35      |
|                              |          | Process factors Management in organization                                       | C36      |
|                              |          | Waste and sewage management  | C37      |
|                              |          | Environmental polluting management   | C38      |
|                              |          | Noise pollution management   | C39      |

The presented criteria and sub criteria of Table 2 are derived from literature customizing by the experts.

## 5. Results and discussions: fuzzy DEMATEL

Fuzzy DEMATEL of this study is similar to its deterministic format but the opinions of the experts are received qualitatively and convert to Fuzzy numbers. Thus, the calculations are undertaken using Fuzzy rules (Chen et al. 2008). The first step of the evaluation process is Fuzzy DEMATEL which is undertaken as follows:

### 5.1. Preparing fuzzy directed impacts matrix

At first, we ask the experts to write their opinion in pairwise comparisons of impacts between measures qualitatively. Actually, they are asked to say the effects of factor *i* (in row) on factor

$j$  (in column) in five levels of judgment: very high, high, low, very low, and no effect. Then, the qualitative measures are fuzzified similar to illustrated in Table 3 (Chen-Yi et al. 2007).

**Table 3. The linguistic variables and the corresponding Fuzzy numbers**

| The variables         | Triangular Fuzzy numbers |
|-----------------------|--------------------------|
| Very High impact (VH) | (0.75,1.0,1.0)           |
| High impact (H)       | (0.5,0.75,1)             |
| Low impact (L)        | (0.25,0.5,0.75)          |
| Very Low impact (VL)  | (0,0.25,0.5)             |
| No impact (NO)        | (0,0,0.25)               |

The opinions of the experts about the cause and effect interactions between criteria and sub criteria are received and integrated using arithmetic mean such as Chen et al. 2008. The output of this step is finding the Fuzzy directed impacts ( $\tilde{Z}$ ). A total of 30 experts in TPC are filled out the DEMATEL questionnaires. Table 4 presents the Fuzzy directed impacts matrix for TPC for the main factors (criteria versus criteria).

**Table 4. The Fuzzy directed impacts matrix for TPC for the main factors (criteria versus criteria)**

| Environmental factors |      |      | Safety factors |      |      | Workplace harmful factors |      |      |                           |
|-----------------------|------|------|----------------|------|------|---------------------------|------|------|---------------------------|
| 0.41                  | 0.65 | 0.87 | 0.44           | 0.68 | 0.93 | 0.00                      | 0.00 | 0.25 | Workplace harmful factors |
| 0.17                  | 0.39 | 0.64 | 0.00           | 0.00 | 0.25 | 0.30                      | 0.53 | 0.76 | Safety factors            |
| 0.00                  | 0.00 | 0.25 | 0.23           | 0.47 | 0.72 | 0.37                      | 0.60 | 0.82 | Environmental factors     |

## 5.2. Defuzzification of directed impacts matrix

Roughly, up to now, the opinions get qualitatively from the experts, then they are fuzzified based on the earlier discussions. Afterward they are integrated to a matrix and finally in this stage they are defuzzified. The method is based on the Opricovic and Tzeng (2003). Therefore, in order to continue the calculations, the impact matrix is needed to be defuzzified and convert to its deterministic counterpart. In this paper the defuzzification process of is utilized in which the authors suggest a five-phase approach in order to defuzzify a triangular fuzzy matrix to a crisp one.

At the first step the initial directed matrix ( $\tilde{Z}$ ) is provided. Assume  $z_{ij} = (l_{ij}, m_{ij}, r_{ij})$  is a triangular Fuzzy member in row  $i$  and the column  $j$  of  $\tilde{Z}$  which means the level of impacts of criteria  $i$  on criteria  $j$ . Then, in the second step, the normalization process should be undertaken. In fact, the  $\tilde{Z}$  matrix is normalized based on the following process and the  $\tilde{X}$  matrix will be achieved.  $l_{ij}$ ,  $m_{ij}$ , and  $r_{ij}$  are the worst case, the most likely case, and the best case respectively. Consequently, the normalization process is performed through the following equations:

$$xl_{ij} = (l_{ij} - \min l_{ij}) / \Delta_{\min}^{\max}, \quad (1)$$

$$xm_{ij} = (m_{ij} - \min l_{ij}) / \Delta_{\min}^{\max} \quad (2)$$

$$xr_{ij} = (r_{ij} - \min l_{ij}) / \Delta_{\min}^{\max}, \quad (3)$$

And we have:  $\Delta_{\min}^{\max} = \max r_{ij} - \min l_{ij}$ .



In Equations 1, 2, and 3  $\min l_{ij}$  is the lowest value of  $l_{ij}$  assigned through the experts and  $\max r_{ij}$  is the highest one. Table 5 illustrates the normalized matrix of TPC.

**Table 5. The normalized matrix**

| Environmental factors |      |      | Safety factors |      |      | Workplace harmful factors |      |      |                           |
|-----------------------|------|------|----------------|------|------|---------------------------|------|------|---------------------------|
| 0.44                  | 0.70 | 0.94 | 0.47           | 0.73 | 1.00 | 0.00                      | 0.00 | 0.27 | Workplace harmful factors |
| 0.18                  | 0.42 | 0.69 | 0.00           | 0.00 | 0.27 | 0.32                      | 0.57 | 0.82 | Safety factors            |
| 0.00                  | 0.00 | 0.27 | 0.25           | 0.51 | 0.77 | 0.40                      | 0.65 | 0.88 | Environmental factors     |

The Third step is to calculate the left normal values (ls) and the right ones (rs) through the following equations:

$$x_{ls_{ij}} = x_{m_{ij}} / (1 + x_{m_{ij}} - x_{l_{ij}}) \tag{4}$$

$$x_{rs_{ij}} = x_{r_{ij}} / (1 + x_{r_{ij}} - x_{m_{ij}}) \tag{5}$$

The results are presented in Table 6.

**Table 6. The results of factors**

| Environmental factors |               | Safety factors |               | Workplace harmful factors |               |                           |
|-----------------------|---------------|----------------|---------------|---------------------------|---------------|---------------------------|
| $x_{ls_{ij}}$         | $x_{rs_{ij}}$ | $x_{ls_{ij}}$  | $x_{rs_{ij}}$ | $x_{ls_{ij}}$             | $x_{rs_{ij}}$ |                           |
| 0.56                  | 0.76          | 0.58           | 0.79          | 0.00                      | 0.21          | Workplace harmful factors |
| 0.34                  | 0.54          | 0.00           | 0.21          | 0.46                      | 0.66          | Safety factors            |
| 0.00                  | 0.21          | 0.40           | 0.61          | 0.52                      | 0.71          | Environmental factors     |

At the fourth step, the final normalized deterministic values are calculated using Equation 6 as follows:

$$x_{ij} = [x_{ls_{ij}}(1 - x_{ls_{ij}}) + x_{rs_{ij}}x_{rs_{ij}}] / [1 - x_{ls_{ij}} + x_{rs_{ij}}]. \tag{6}$$

The results are presented in Table 7.

**Table 7. The result of factors**

| Workplace harmful factors | Safety factors | Environmental factors |                           |
|---------------------------|----------------|-----------------------|---------------------------|
| 0.682                     | 0.716          | 0.037                 | Workplace harmful factors |
| 0.431                     | 0.037          | 0.565                 | Safety factors            |
| 0.037                     | 0.507          | 0.634                 | Environmental factors     |

Finally, the defuzzified values are calculated utilizing Equation 7 and the results can be seen in Table 8.

$$z_{ij} = \min l_{ij} + x_{ij} \Delta_{\min}^{\max}. \tag{7}$$

**Table 8. The final directed impacts matrix**

| Workplace harmful factors | Safety factors | Environmental factors |                                  |
|---------------------------|----------------|-----------------------|----------------------------------|
| 0.634                     | 0.666          | 0.034                 | <b>Workplace harmful factors</b> |
| 0.401                     | 0.034          | 0.526                 | <b>Safety factors</b>            |
| 0.034                     | 0.471          | 0.590                 | <b>Environmental factors</b>     |

Problem the values of Table 8 are the results of Fuzzy DEMATEL analysis which lead us to impacts matrix. As it is expected, the workplace harmful factors and the safety factors have a strong impact to each other.

Utilizing Equations 8, 9, and 10, the impacts values are used to provide the estimations of relations between criteria in ANP network and super matrix. The normalized T-matrix which is presented in the following tables which are calculated through dividing each member to sum of its associated column. The values of Table 8 are the Z matrix in the calculations.

$$X = s.Z \tag{8}$$

$$s = \min\{1/\max_{1 \leq i \leq n} \sum_{j=1}^n z_{ij}, 1/\max_{1 \leq j \leq n} \sum_{i=1}^n z_{ij}\}, i, j = 1, 2, \dots, n \tag{9}$$

$$T = X(I - X)^{-1} \tag{10}$$

The total of the values in rows and columns of T-matrix are called D and R vectors respectively which are calculated through Equations 11 to 13 as follows:

$$T = [t_{ij}]_{n \times n}, i, j = 1, 2, \dots, n \tag{11}$$

$$D = [\sum_{j=1}^n t_{ij}]_{n \times 1} = [t_{i.}]_{n \times 1} \tag{12}$$

$$R = [\sum_{i=1}^n t_{ij}]_{1 \times n} = [t_{.j}]_{n \times 1} \tag{13}$$

Then, the horizontal axis (importance axis) and vertical axis (relation axis) are calculated by the addition of the row and column (D + R) and the difference of row and column (D – R) respectively. The results for IKCO and TPC are shown in Table 9 and 10 respectively.

**Table 9. Total impact matrix comparison (IKCO)**

| D- R   | D+R   | R     | D     | C3    | C2    | C1    |  |
|--------|-------|-------|-------|-------|-------|-------|--|
| 0.764  | 6.458 | 2.847 | 3.611 | 0.441 | 0.456 | 0.342 | <b>Harmful Factors in Workplace (C1)</b> |
| -0.462 | 5.905 | 3.184 | 2.722 | 0.330 | 0.261 | 0.352 | <b>Immunity Indicators (C2)</b>          |
| -0.302 | 5.074 | 2.688 | 2.386 | 0.229 | 0.283 | 0.305 | <b>Environmental Indicators (C3)</b>     |

**Table 10. Total impact matrix comparison (TPC)**

| D- R   | D+R    | R     | D     | C3    | C2    | C1    |   |
|--------|--------|-------|-------|-------|-------|-------|---|
| 0.615  | 11.804 | 5.594 | 6.209 | 2.094 | 2.235 | 1.881 | <b>Harmful Factors in Workplace (C1)</b><br><b>Immunity Indicators (C2)</b><br><b>Environmental Indicators (C3)</b> |
| -0.757 | 10.621 | 5.689 | 4.932 | 1.640 | 1.525 | 1.766 |   |
| 0.142  | 10.753 | 5.305 | 5.447 | 1.571 | 1.929 | 1.947 |   |

**5.3. Finding the impacts matrix of sub criteria**

Similar process of calculations in Section 5.2 are undertaken in order achieve the impacts among sub criteria. In fact, in order to provide the appropriate network for the ANP, all the relations between criteria and sub criteria should be analyzed. The results for IKCO are illustrated in Tables 11 to 13.

**Table 11. Total impact matrix comparison for sub criteria of workplace harmful factors (IKCO)**

| D- R   | D+R   | R     | D     | C15   | C14   | C13   | C12   | C11   |            |
|--------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| 0.471  | 3.778 | 1.653 | 2.124 | 0.261 | 0.276 | 0.290 | 0.275 | 0.189 | <b>C11</b> |
| 0.269  | 3.201 | 1.466 | 1.735 | 0.261 | 0.222 | 0.215 | 0.152 | 0.222 | <b>C12</b> |
| 0.132  | 3.467 | 1.667 | 1.800 | 0.200 | 0.249 | 0.162 | 0.219 | 0.245 | <b>C13</b> |
| -1.044 | 4.042 | 2.543 | 1.499 | 0.174 | 0.133 | 0.211 | 0.199 | 0.222 | <b>C14</b> |
| 0.171  | 1.876 | 0.852 | 1.024 | 0.104 | 0.120 | 0.121 | 0.155 | 0.122 | <b>C15</b> |

**Table 12. Total impact matrix comparison for sub criteria of safety factors (IKCO)**

| D- R   | D+R   | R     | D     | C27   | C26   | C25   | C24   | C23   | C22   | C21   |            |
|--------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| -0.014 | 3.513 | 1.763 | 1.749 | 0.149 | 0.144 | 0.131 | 0.150 | 0.154 | 0.159 | 0.101 | <b>C21</b> |
| 0.026  | 3.546 | 1.760 | 1.786 | 0.151 | 0.149 | 0.157 | 0.151 | 0.142 | 0.103 | 0.158 | <b>C22</b> |
| -0.018 | 3.016 | 1.517 | 1.499 | 0.136 | 0.135 | 0.120 | 0.117 | 0.089 | 0.111 | 0.130 | <b>C23</b> |
| -0.030 | 3.210 | 1.620 | 1.590 | 0.141 | 0.133 | 0.124 | 0.093 | 0.131 | 0.135 | 0.134 | <b>C24</b> |
| -0.035 | 2.768 | 1.402 | 1.367 | 0.129 | 0.110 | 0.083 | 0.106 | 0.101 | 0.122 | 0.107 | <b>C25</b> |
| 0.071  | 3.407 | 1.668 | 1.739 | 0.149 | 0.100 | 0.140 | 0.152 | 0.146 | 0.147 | 0.147 | <b>C26</b> |
| 0.000  | 5.254 | 2.627 | 2.627 | 0.145 | 0.228 | 0.245 | 0.231 | 0.237 | 0.224 | 0.224 | <b>C27</b> |

**Table 13. Total impact matrix comparison for sub criteria of Environmental factors (IKCO)**

| D- R   | D+R    | R     | D     | C39   | C38   | C37   | C36   | C35   | C34   | C33   | C32   | C31   |            |
|--------|--------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| 0.662  | 11.411 | 5.374 | 6.037 | 0.145 | 0.135 | 0.134 | 0.133 | 0.135 | 0.132 | 0.131 | 0.131 | 0.113 | <b>C31</b> |
| -0.094 | 10.259 | 5.177 | 5.083 | 0.107 | 0.109 | 0.109 | 0.112 | 0.114 | 0.120 | 0.118 | 0.097 | 0.109 | <b>C32</b> |
| 0.262  | 9.872  | 4.805 | 5.067 | 0.104 | 0.111 | 0.109 | 0.112 | 0.114 | 0.118 | 0.096 | 0.113 | 0.111 | <b>C33</b> |
| -0.358 | 11.165 | 5.762 | 5.403 | 0.114 | 0.119 | 0.117 | 0.120 | 0.122 | 0.102 | 0.121 | 0.125 | 0.120 | <b>C34</b> |
| -0.132 | 10.093 | 5.112 | 4.981 | 0.105 | 0.109 | 0.116 | 0.112 | 0.095 | 0.108 | 0.111 | 0.111 | 0.109 | <b>C35</b> |
| -0.185 | 11.736 | 5.960 | 5.775 | 0.136 | 0.129 | 0.129 | 0.108 | 0.127 | 0.128 | 0.129 | 0.127 | 0.126 | <b>C36</b> |
| 0.168  | 10.446 | 5.139 | 5.307 | 0.105 | 0.120 | 0.101 | 0.117 | 0.123 | 0.115 | 0.116 | 0.118 | 0.120 | <b>C37</b> |
| -0.146 | 10.872 | 5.509 | 5.363 | 0.125 | 0.101 | 0.125 | 0.119 | 0.112 | 0.116 | 0.116 | 0.120 | 0.122 | <b>C38</b> |
| -0.177 | 5.865  | 3.021 | 2.844 | 0.057 | 0.067 | 0.059 | 0.066 | 0.057 | 0.059 | 0.062 | 0.059 | 0.070 | <b>C39</b> |

Furthermore, the results for TPC are illustrated in Tables 14 to 16 as follows:

**Table 14. Total impact matrix comparison for sub criteria of workplace harmful factors (TPC)**

| D- R   | D+R   | R     | D     | C15   | C14   | C13   | C12   | C11   |            |
|--------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| 0.259  | 8.147 | 3.944 | 4.203 | 0.227 | 0.235 | 0.236 | 0.235 | 0.189 | <b>C11</b> |
| 0.415  | 7.625 | 3.605 | 4.020 | 0.233 | 0.224 | 0.213 | 0.181 | 0.221 | <b>C12</b> |
| -0.196 | 7.065 | 3.630 | 3.435 | 0.182 | 0.192 | 0.156 | 0.185 | 0.196 | <b>C13</b> |
| -0.588 | 8.626 | 4.607 | 4.019 | 0.218 | 0.180 | 0.230 | 0.227 | 0.227 | <b>C14</b> |
| 0.110  | 6.026 | 2.958 | 3.068 | 0.140 | 0.169 | 0.165 | 0.172 | 0.167 | <b>C15</b> |

**Table 15. Total impact matrix comparison for sub criteria of safety factors (TPC)**

| D- R   | D+R   | R     | D     | C27   | C26   | C25   | C24   | C23   | C22   | C21   |            |
|--------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| -0.131 | 3.913 | 2.022 | 1.891 | 0.144 | 0.135 | 0.127 | 0.143 | 0.139 | 0.149 | 0.098 | <b>C21</b> |
| -0.052 | 3.923 | 1.987 | 1.935 | 0.146 | 0.145 | 0.143 | 0.140 | 0.138 | 0.100 | 0.146 | <b>C22</b> |
| -0.092 | 3.677 | 1.885 | 1.793 | 0.139 | 0.137 | 0.124 | 0.127 | 0.094 | 0.129 | 0.133 | <b>C23</b> |
| -0.039 | 3.684 | 1.862 | 1.823 | 0.140 | 0.135 | 0.130 | 0.095 | 0.134 | 0.131 | 0.134 | <b>C24</b> |
| 0.087  | 3.270 | 1.592 | 1.679 | 0.133 | 0.121 | 0.090 | 0.121 | 0.116 | 0.121 | 0.118 | <b>C25</b> |
| 0.227  | 3.992 | 1.882 | 2.110 | 0.154 | 0.109 | 0.154 | 0.154 | 0.160 | 0.155 | 0.157 | <b>C26</b> |
| 0.000  | 5.754 | 2.877 | 2.877 | 0.145 | 0.219 | 0.233 | 0.220 | 0.219 | 0.215 | 0.214 | <b>C27</b> |

**Table 16. Total impact matrix comparison for sub criteria of Environmental factors (TPC)**

| D- R  | D+R   | R     | D     | C39   | C38   | C37   | C36   | C35   | C34   | C33   | C32   | C31   |            |
|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|------------|
| -0.01 | 24.20 | 12.10 | 12.09 | 0.125 | 0.124 | 0.123 | 0.121 | 0.120 | 0.120 | 0.120 | 0.119 | 0.112 | <b>C31</b> |
| -0.49 | 23.17 | 11.83 | 11.34 | 0.113 | 0.111 | 0.112 | 0.114 | 0.115 | 0.116 | 0.116 | 0.105 | 0.111 | <b>C32</b> |
| 0.56  | 23.12 | 11.28 | 11.84 | 0.118 | 0.117 | 0.118 | 0.118 | 0.120 | 0.121 | 0.110 | 0.120 | 0.117 | <b>C33</b> |
| -0.41 | 23.31 | 11.86 | 11.45 | 0.113 | 0.113 | 0.114 | 0.114 | 0.117 | 0.106 | 0.117 | 0.118 | 0.113 | <b>C34</b> |
| 0.54  | 22.42 | 10.94 | 11.48 | 0.113 | 0.113 | 0.116 | 0.115 | 0.107 | 0.116 | 0.116 | 0.116 | 0.114 | <b>C35</b> |
| 0.54  | 23.70 | 11.58 | 12.12 | 0.122 | 0.122 | 0.122 | 0.112 | 0.120 | 0.121 | 0.122 | 0.121 | 0.121 | <b>C36</b> |
| 0.21  | 23.10 | 11.45 | 11.65 | 0.114 | 0.119 | 0.108 | 0.117 | 0.117 | 0.115 | 0.116 | 0.115 | 0.119 | <b>C37</b> |
| -0.34 | 22.93 | 11.64 | 11.29 | 0.114 | 0.105 | 0.115 | 0.114 | 0.112 | 0.112 | 0.112 | 0.111 | 0.117 | <b>C38</b> |
| -0.61 | 15.40 | 8.01  | 7.39  | 0.069 | 0.076 | 0.073 | 0.075 | 0.072 | 0.073 | 0.073 | 0.073 | 0.076 | <b>C39</b> |

The results of Table 11 to 16 can appropriately present the cause and effects relations between sub criteria of the main factors with each other. It should be mentioned that the calculations of DEMATEL are undertaken using MATLAB software and ANP is obtained through "super decision" software.

## 6. Results and discussions: fuzzy ANP

The process of assigning weights to the criteria and sub criteria is performed using Fuzzy ANP. In order to provide the ANP super matrix three types of information are needed:

- The results of DEMATEL in finding total impacts comparisons for criteria
- The results of DEMATEL in finding total impacts comparisons for sub criteria
- The weights of each criteria and sub criteria achieved by pairwise comparison questionnaires and analyses in ANP.

The first two abovementioned steps are the outputs of the Fuzzy DEMATEL and the third step should be provided through ANP analysis.

### 6.1. Calculating the weights of criteria and sub criteria

In order to find the related weights for each of the criteria and sub criteria, the experts are asked to compare the criteria and sub criteria using qualitative variables. Then the variables are converted to Fuzzy numbers utilizing Table 17 from 25 Wei and Yu 2007.

**Table 17. Converting the linguistic variables to Fuzzy numbers (Wei and Yu 2007)**

| Fuzzy number        | Linguistic variable (The priorities) |
|---------------------|--------------------------------------|
| (1,1,1)             | Equal                                |
| (2,3,4)             | Weak                                 |
| (4,5,6)             | Fairly strong                        |
| (6,7,8)             | Very strong                          |
| (8,9,9)             | Absolute                             |
| $(X + 1, X, X - 1)$ | The middle values                    |

Integrating the opinions of the experts is undertaken through geometrical mean of fuzzy numbers (see Equation 14).

$$\tilde{z}_{ij} = \left( \sqrt[k]{l_1 \times l_2 \times \dots \times l_k}, \sqrt[k]{m_1 \times m_2 \times \dots \times m_k}, \sqrt[k]{r_1 \times r_2 \times \dots \times r_k} \right) \quad (14)$$

The final results for IKCO and TPC are presented in Tables 18 and 19 respectively.

**Table 18. The integrated Fuzzy pairwise comparisons of 30 experts for criteria (IKCO)**

|    | C1    |       |       | C2    |       |       | C3    |       |       |
|----|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| C1 | 1     | 1     | 1     | 0.348 | 0.413 | 0.505 | 2.944 | 3.598 | 4.270 |
| C2 | 1.979 | 2.419 | 2.870 | 1     | 1     | 1     | 3.695 | 4.440 | 5.008 |
| C3 | 0.234 | 0.278 | 0.340 | 0.200 | 0.225 | 0.271 | 1     | 1     | 1     |

**Table 19. The integrated Fuzzy pairwise comparisons of 30 experts for criteria (TPC)**

|    | C1    |       |       | C2    |       |       | C3    |       |       |
|----|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| C1 | 1     | 1     | 1     | 0.525 | 0.572 | 0.634 | 1.428 | 1.733 | 2.032 |
| C2 | 1.578 | 1.748 | 1.906 | 1     | 1     | 1     | 3.109 | 3.722 | 4.282 |
| C3 | 0.492 | 0.577 | 0.700 | 0.234 | 0.269 | 0.322 | 1     | 1     | 1     |

The defuzzification process of Table 18 and 19 is the same as presented in Section 5.2. The results can be seen in Tables 20 and 21. Furthermore, the consistency ratios (CR) of each

comparison are reported at the end of the tables. The local weights are also calculated using Equation 14 in the last columns of Tables 20 and 21.

**Table 20. The defuzzified comparison matrix and the local weights for criteria (IKCO)**

|                     | C1    | C2    | C3    | Local weight |
|---------------------|-------|-------|-------|--------------|
| C1                  | 1.000 | 0.416 | 3.575 | 0.306        |
| C2                  | 2.424 | 1.000 | 4.368 | 0.588        |
| C3                  | 0.279 | 0.226 | 1.000 | 0.107        |
| <b>CR=0.033≤0.1</b> |       |       |       |              |

**Table 21. The defuzzified comparison matrix and the local weights for criteria (TPC)**

|                     | C1    | C2    | C3    | Local weight |
|---------------------|-------|-------|-------|--------------|
| C1                  | 1.000 | 0.574 | 1.736 | 0.294        |
| C2                  | 1.747 | 1.000 | 3.673 | 0.547        |
| C3                  | 0.583 | 0.269 | 1.000 | 0.159        |
| <b>CR=0.014≤0.1</b> |       |       |       |              |

The consistency ratios of the pairwise analysis in Table 20 and 21 are in acceptable range of being below 0.1. The results in IKCO and TPC are almost similar in terms of the final weights. Safety factors get the highest local weights for IKCO and TPC and environmental factors get the lowest.

## 6.2. Calculating the weights of sub criteria

The same analyses are performed in order to find the local weights of sub criteria for IKCO and TPC. The IKCO results are shown in Tables 21 to 23.

**Table 22. The defuzzified comparison matrix and the local weights for sub criteria (IKCO)**

|                     | C11   | C12   | C13   | C14   | C15   | Local weight |
|---------------------|-------|-------|-------|-------|-------|--------------|
| C11                 | 1.000 | 0.538 | 0.530 | 1.399 | 3.102 | 0.179        |
| C12                 | 1.877 | 1.000 | 0.966 | 2.257 | 4.483 | 0.307        |
| C13                 | 1.901 | 1.051 | 1.000 | 2.701 | 3.885 | 0.316        |
| C14                 | 0.730 | 0.447 | 0.372 | 1.000 | 2.096 | 0.131        |
| C15                 | 0.322 | 0.221 | 0.255 | 0.484 | 1.000 | 0.067        |
| <b>CR=0.076≤0.1</b> |       |       |       |       |       |              |

**Table 23. The defuzzified comparison matrix and the local weights for sub criteria (IKCO)**

|                     | C21   | C22   | C23   | C24   | C25   | C26   | C27   | Local weight |
|---------------------|-------|-------|-------|-------|-------|-------|-------|--------------|
| C21                 | 1.000 | 0.974 | 2.875 | 0.739 | 3.887 | 1.793 | 0.660 | 0.173        |
| C22                 | 1.038 | 1.000 | 3.539 | 0.942 | 3.969 | 2.348 | 0.715 | 0.196        |
| C23                 | 0.349 | 0.281 | 1.000 | 0.300 | 1.657 | 0.925 | 0.434 | 0.072        |
| C24                 | 1.355 | 1.078 | 3.317 | 1.000 | 2.800 | 2.459 | 0.816 | 0.201        |
| C25                 | 0.254 | 0.249 | 0.615 | 0.360 | 1.000 | 0.509 | 0.333 | 0.053        |
| C26                 | 0.568 | 0.429 | 1.098 | 0.412 | 1.984 | 1.000 | 0.422 | 0.089        |
| C27                 | 1.530 | 1.410 | 2.304 | 1.254 | 2.996 | 2.377 | 1.000 | 0.216        |
| <b>CR=0.064≤0.1</b> |       |       |       |       |       |       |       |              |

**Table 24. The defuzzified comparison matrix and the local weights for sub criteria (IKCO)**

|     | C31   | C32   | C33   | C34   | C35   | C36   | C37   | C38   | C39   | Local weight |
|-----|-------|-------|-------|-------|-------|-------|-------|-------|-------|--------------|
| C31 | 1.000 | 0.904 | 1.212 | 0.623 | 0.590 | 0.547 | 0.427 | 0.335 | 0.835 | 0.071        |
| C32 | 1.120 | 1.000 | 1.667 | 0.270 | 1.021 | 0.925 | 0.659 | 0.616 | 2.088 | 0.096        |
| C33 | 0.840 | 0.606 | 1.000 | 0.281 | 0.605 | 0.806 | 0.456 | 0.401 | 0.977 | 0.065        |
| C34 | 1.638 | 3.661 | 3.534 | 1.000 | 1.393 | 1.417 | 0.666 | 1.035 | 0.892 | 0.153        |
| C35 | 1.717 | 0.991 | 1.679 | 0.724 | 1.000 | 0.632 | 0.668 | 0.618 | 0.439 | 0.091        |
| C36 | 1.867 | 1.113 | 1.246 | 0.724 | 1.595 | 1.000 | 0.918 | 1.681 | 1.004 | 0.126        |
| C37 | 2.355 | 1.531 | 2.204 | 1.516 | 1.507 | 1.099 | 1.000 | 0.467 | 0.525 | 0.127        |
| C38 | 2.970 | 1.647 | 2.501 | 0.989 | 1.643 | 0.598 | 1.901 | 1.000 | 0.561 | 0.141        |
| C39 | 1.224 | 0.487 | 1.044 | 1.146 | 2.292 | 1.013 | 1.921 | 1.799 | 1.000 | 0.129        |

CR=0.081≤0.1

Besides, the results of integrated defuzzified pairwise comparisons of 30 experts for TPC are illustrated in Table 24 to 26.

**Table 25. The defuzzified comparison matrix and the local weights for sub criteria (TPC)**

|     | C11   | C12   | C13   | C14   | C15   | Local weight |
|-----|-------|-------|-------|-------|-------|--------------|
| C11 | 1.000 | 0.222 | 1.333 | 0.326 | 0.771 | 0.097        |
| C12 | 4.445 | 1.000 | 4.648 | 1.392 | 2.761 | 0.393        |
| C13 | 0.763 | 0.212 | 1.000 | 0.272 | 1.104 | 0.089        |
| C14 | 3.069 | 0.725 | 3.665 | 1.000 | 2.824 | 0.307        |
| C15 | 1.317 | 0.363 | 0.916 | 0.354 | 1.000 | 0.113        |

CR=0.095≤0.1

**Table 26. The defuzzified comparison matrix and the local weights for sub criteria (TPC)**

|     | C21   | C22   | C23   | C24   | C25   | C26   | C27   | Local weight |
|-----|-------|-------|-------|-------|-------|-------|-------|--------------|
| C21 | 1.000 | 0.582 | 1.279 | 1.449 | 5.402 | 1.904 | 0.612 | 0.169        |
| C22 | 1.724 | 1.000 | 2.427 | 1.939 | 4.517 | 2.169 | 0.719 | 0.229        |
| C23 | 0.794 | 0.416 | 1.000 | 1.012 | 2.377 | 1.580 | 0.770 | 0.128        |
| C24 | 0.695 | 0.520 | 1.004 | 1.000 | 3.128 | 1.067 | 0.754 | 0.127        |
| C25 | 0.182 | 0.219 | 0.422 | 0.320 | 1.000 | 0.354 | 0.378 | 0.046        |
| C26 | 0.531 | 0.465 | 0.637 | 0.948 | 2.846 | 1.000 | 0.566 | 0.105        |
| C27 | 1.649 | 1.411 | 1.314 | 1.335 | 2.647 | 1.786 | 1.000 | 0.196        |

CR=0.037≤0.1

**Table 27. The defuzzified comparison matrix and the local weights for sub criteria (TPC)**

|     | C31   | C32   | C33   | C34   | C35   | C36   | C37   | C38   | C39   | Local weight |
|-----|-------|-------|-------|-------|-------|-------|-------|-------|-------|--------------|
| C31 | 1.000 | 2.453 | 2.165 | 1.145 | 2.216 | 0.688 | 0.709 | 0.555 | 1.319 | 0.121        |
| C32 | 0.408 | 1.000 | 0.834 | 0.379 | 0.801 | 0.485 | 0.386 | 0.255 | 0.901 | 0.056        |
| C33 | 0.464 | 1.217 | 1.000 | 0.782 | 1.104 | 0.712 | 0.488 | 0.301 | 0.868 | 0.072        |
| C34 | 0.880 | 2.640 | 1.291 | 1.000 | 1.042 | 0.735 | 0.764 | 0.529 | 1.282 | 0.104        |
| C35 | 0.455 | 1.259 | 0.920 | 0.967 | 1.000 | 0.690 | 0.645 | 0.463 | 1.225 | 0.081        |
| C36 | 1.473 | 2.087 | 1.427 | 1.381 | 1.464 | 1.000 | 1.189 | 1.037 | 1.866 | 0.142        |
| C37 | 1.429 | 2.593 | 2.065 | 1.336 | 1.571 | 0.851 | 1.000 | 0.274 | 2.495 | 0.131        |
| C38 | 1.807 | 3.870 | 3.309 | 1.908 | 2.186 | 0.971 | 3.691 | 1.000 | 2.950 | 0.220        |
| C39 | 0.773 | 1.139 | 1.179 | 0.791 | 0.828 | 0.546 | 0.402 | 0.340 | 1.000 | 0.073        |

CR=0.087≤0.1

The final point which should be mentioned is the acceptable CR for all of the calculations in the abovementioned tables which can guarantee the validity of the experts' opinions. The final step in order to achieve the ultimate weights is providing the super matrix.

### 6.3. Calculating the weights of sub criteria

The T-normal matrix, the impacts between all criteria and sub criteria, and the local weights are used in order to provide the super matrix. The matrixes for IKCO and TPC are illustrated in Tables 27 and 28 respectively. Matlab software is used to find the appropriate power of  $2k+1$  of the super matrixes. Here, the final weights are achieved in the power of 33. The results of the final weights are illustrated in Table 29 and 30 for IKCO and TPC respectively.

**Table 28. The final weights of the criteria and sub criteria (IKCO)**

| Major criteria                     | Weights of major criteria (priority) | Sub-criteria   | Weights of Sub-criteria |
|------------------------------------|--------------------------------------|--|-------------------------|
| Harmful Factors in Workplace (C1)  | 0.1196 (2)                           | Physical environment of workplace such as noise, light, etc.                     | 0.0262                  |
|                                    |                                      | Chemical factors such as steam, smoke, heat, cold, vibration                     | 0.0307                  |
|                                    |                                      | Ergonomic factors  | 0.0316                  |
|                                    |                                      | Psychological factors such as job stress, quarrel, strike of employees and so on | 0.0194                  |
|                                    |                                      | Biological factors such as bacteria, parasite, fungus, etc.                      | 0.0116                  |
| Immunity Indicators (C2)           | 0.1492 (1)                           | Electricity immunity   | 0.0235                  |
|                                    |                                      | Fire immunity  | 0.0253                  |
|                                    |                                      | Individual protection immunity (use of shoes, hat, gloves, mask, uniforms, etc.  | 0.0145                  |
|                                    |                                      | Immunity of equipment and tools  | 0.0246                  |
|                                    |                                      | Furnishing   | 0.0122                  |
|                                    |                                      | Teaching immunity to employees such as first aids                                | 0.0173                  |
| Environmental Indicators (C3)      | 0.0644(3)                            | Risk management program in organization  | 0.0319                  |
|                                    |                                      | Environmental evaluation   | 0.0066                  |
|                                    |                                      | Energy consumption per capita  | 0.0067                  |
|                                    |                                      | Energy auditing studies  | 0.0057                  |
|                                    |                                      | Prevention of energy wasting   | 0.0087                  |
|                                    |                                      | Water consumption per capita   | 0.0064                  |
|                                    |                                      | Process factors Management in organization                                       | 0.0081                  |
|                                    |                                      | Waste and sewage management  | 0.0078                  |
| Environmental polluting management | 0.0083                               |  |                         |
| Noise pollution management         | 0.0062                               |  |                         |



**Table 29. The final weights of the criteria and sub criteria (TPC)**

| Major criteria                    | Weights of major criteria (priority) | Sub-criteria   | Weights of Sub-criteria |
|-----------------------------------|--------------------------------------|--|-------------------------|
| Harmful Factors in Workplace (C1) | 0.111 (2)                            | Physical environment of workplace such as noise, light, etc.                     | 0.018                   |
|                                   |                                      | Chemical factors such as steam, smoke, heat, cold, vibration                     | 0.034                   |
|                                   |                                      | Ergonomic factors  | 0.015                   |
|                                   |                                      | Psychological factors such as job stress, quarrel, strike of employees and so on | 0.029                   |
|                                   |                                      | Biological factors such as bacteria, parasite, fungus, etc.                      | 0.015                   |
| Immunity Indicators (C2)          | 0.140 (1)                            | Electricity immunity   | 0.021                   |
|                                   |                                      | Fire immunity  | 0.026                   |
|                                   |                                      | Individual protection immunity (use of shoes, hat, gloves, mask, uniforms, etc.  | 0.018                   |
|                                   |                                      | Immunity of equipment and tools  | 0.018                   |
|                                   |                                      | Furnishing   | 0.012                   |
|                                   |                                      | Teaching immunity to employees such as first aids                                | 0.018                   |
|                                   |                                      | Risk management program in organization  | 0.028                   |
| Environmental Indicators (C3)     | 0.082 (3)                            | Environmental evaluation   | 0.010                   |
|                                   |                                      | Energy consumption per capita  | 0.007                   |
|                                   |                                      | Energy auditing studies  | 0.008                   |
|                                   |                                      | Prevention of energy wasting   | 0.009                   |
|                                   |                                      | Water consumption per capita   | 0.008                   |
|                                   |                                      | Process factors Management in organization                                       | 0.011                   |
|                                   |                                      | Waste and sewage management  | 0.010                   |
|                                   |                                      | Environmental polluting management   | 0.014                   |
| Noise pollution management        | 0.006                                |  |                         |

The results of Tables 29 and 30 lead both companies to the priorities of the criteria and sub criteria in HSE evaluation system. The schematic and comparative views of the results for two companies are presented in Figure 2. The results prove that in IKCO risk management program in organization, ergonomic factors, and chemical factors such as steam, smoke, heat, cold, vibration are the three main sub criteria respectively. Besides, in TPC chemical factors such as steam, smoke, heat, cold, vibration, psychological factors such as job stress, quarrel, strike of employees and so on, and risk management program in organization are the on the top. Interestingly, chemical factors and risk management are on the top three of both of the companies which can imply to general importance of these sub criteria disregarding the industry. The schematic representation of the results is presented in Figure 2.

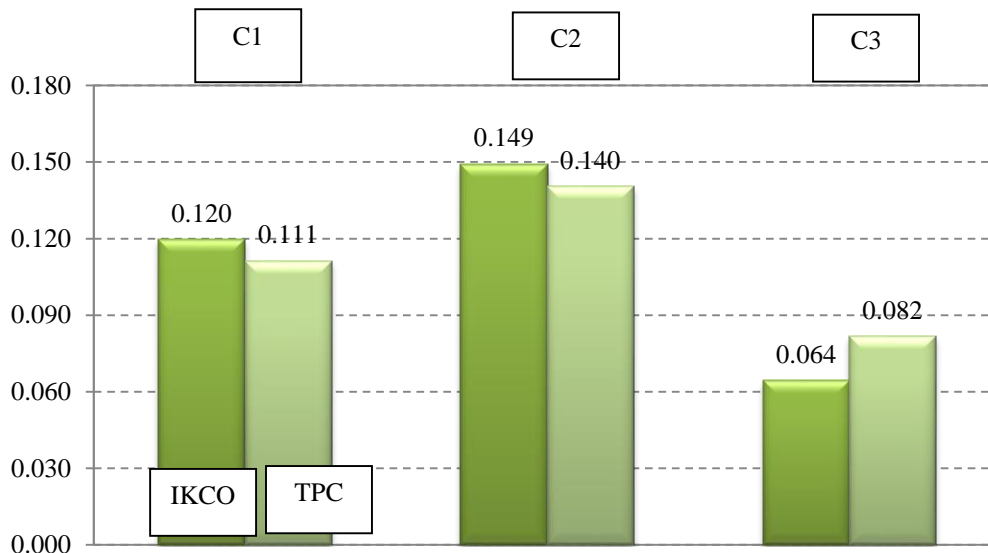


Figure 2. The final weights for three main factors

The analysis of the final results is completely interesting. In despite of the fact that the pairwise comparisons are absolutely independent in terms of companies and experts, the both ultimate weights and rankings are clearly similar. The safety factors are in the top priority list of evaluating HSE system for IKCO and TPC with the weights of 0.149 and 0.140 respectively. At the second place, we can see workplace harmful factors for IKCO and TPC with the weights of 0.120 and 0.111 respectively. Environmental factors get the lowest priorities but it is the only factor that TPC presents the higher value (0.082) in comparison with IKCO (0.064) which means that in petrochemical companies environmental factors are more considerable compared to automotive counterparts.

## 7. Conclusion and future research

This paper develops a new Fuzzy-DEMATEL-ANP method in order to find the main criteria and sub criteria of evaluating HSE systems and analyzing the relations between them. Besides, through the pairwise comparisons, the criteria and sub criteria are prioritized for two of the largest companies in Iran, one in automotive and the other in petrochemical industry. Fuzzy approach is exploited in order to have near-to-reality experts' information.

The final results are somehow appealing when we find the ranking of the main factors exactly the same. Safety factors are the most significant criteria for both companies. Workplace harmful factors and environmental factors are the second and the third in the achieved ranking. For IKCO, safety factors, workplace harmful factors and environmental factors get the weights of 0.149, 0.120, and 0.064 respectively. Furthermore, for IKCO, safety factors, workplace harmful factors and environmental factors get the weights of 0.140, 0.111, and 0.082 respectively.

The presented model can be extended in other automotive and petrochemical companies in order to evaluate HSE systems. However, the similar results in two companies can lead us to the conclusion that we would expect similar ranking in other industries in Iran based on the similarities in administration approaches.

There are some similar researches based on this study. The evaluations of HSE systems can be undertaken in IKCO and TPC in order to find the practical results of the model. However, it needs a scoring system for the model. In order to complete the evaluation system, a data

envelopment analysis can be added as an evaluator at the evaluation stage of the model. Finally, a decision support system can be developed based on the achievements of this study.

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