# CRFM: AN APPLICATION OF THE FUZZY LOGIC IN APELL PROGRAMME

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#### ABSTRACT

The Awareness and Preparedness for Emergencies at Local Level (APELL) Programme was initiated in the late1980s in response to a number of chemical accidents that resulted in deaths and injuries, environmental damage, and extensive economic consequences in the surrounding communities. Initially, the APELL Programme focused on assisting decision-makers and technical personnel in improving community awareness of industrial hazards and in preparing response plans for chemical accidents. Nowadays, it is also applicable to natural hazards. This paper aims to provide to community, locallevel institutions, industry, experts and other stakeholders a tool, using Fuzzy Relation, the Community Risk Fuzzy Model (CRFM) to estimate the various types of risk they are exposed to, supporting the decision-making process, especially as to whether or not further assessments are needed. This tool will be developed based on an existing one, named Community Risk Profile (CRP), of the United Nations Environment Programme (UNEP). An application of CRFM will be presented using three communities at risk of flooding located in the metropolitan area of the City of Rio de Janeiro, Brazil. *Keywords: APELL, Brazil, CRFM, emergency, flood risk, Fuzzy Logic, hazards, UNEP*.

## **1 INTRODUCTION**

From the 1960s onwards, the chemical and petrochemical industries contributed strongly to the increase in potential accidents, due to the expansion of the scale of processing plants that rose rapidly for several decades, for economic reasons [1]. During the 1970s and 1980s, major accidents occurred at several locations all over the world, with heavy losses in terms of human lives and corporate assets, in addition to direct impacts on local eco-systems that resulted in irreparable damage for society [2].

These accidents spurred these industries to seek efficient mechanisms that would upgrade their operations, with fewer faults and less serious damages, identifying problems before major accidents occur, as well as paying closer attention to planning future response actions [3]. So, the accident prevention and emergency response planning areas became controversial aspects, due to a number of chemical accidents that resulted in deaths and injuries, environmental damage, and extensive economic consequences in the surrounding communities whose spatial distribution varied widely. In the late 1980s, The Awareness and Preparedness for Emergencies at Local Level (APELL) Programme was initiated by United Nations Environment Programme (UNEP) to assist communities with chemical hazards in preventing and preparing for industrial accidents. It is a methodological tool focusing on the local level for identifying possible industrial hazards, raising awareness, and establishing or building local capacity for immediate, multi-party responses in the event that an emergency occurs. The goal of APELL is to promote a community-oriented framework to identify and create



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© 2016 WIT Press, www.witpress.com ISSN: 2041-9031 (paper format), ISSN: 2041-904X (online), http://www.witpress.com/journals DOI: 10.2495/SAFE-V6-N1-63-72 awareness of risks in industrialized communities to initiate measures for risk reduction and mitigation, and to develop coordinated preparedness between industries, local authorities, and communities by building local partnerships between stakeholders.

One of the first steps in reducing community vulnerability to accidents and disasters is to assess the different hazards present in a community. The Multi-Hazard Matrix system is a simple tool that can be used for initial community self-assessment of existing risks. The approach proposed in the Multi-Hazard Matrix is a simplified version of the methodology used in the Community Risk Profile (CRP) Tool developed by INERIS for UNEP and visually presents information on various risks within the community. The CRP tool [4] provides communities with a means of making a rough estimate of various types of risks they are exposed to, supporting the decision-making process, especially as to whether or not further assessments are needed. The CRP is not, therefore, a risk assessment tool. It is a tool that will provide users with a qualitative approach to characterize an expected level of risk and thus decide on the necessity for further assessment. It is also a tool that can be used to support awareness raising and capacity-building activities.

This paper aims to provide to authorities a risk classification tool, using Fuzzy Relation – Community Risk Fuzzy Model (CRFM), to optimize the investments concerning to life preservation in communities exposed to risk of flooding, supporting the decision-making process. This tool will be developed based on the methodology used in the CRP. An application of new tool will be accomplished.

## 2 APELL PROGRAMME

The APELL Programme uses a Multi-Hazard Matrix [5] which is a hazard-rating tool that uses a set of ten criteria to judge the type(s) and the magnitude(s) of the risks that a given community is exposed to. Each hazard source identified is assessed using ten different risk criteria, and assigned a number between 1 and 5 for each risk criterion. A 1 is assigned for a favorable situation (such as a low hazard, low level of vulnerability, or a sufficient level of risk control), and a 5 is assigned for an unfavorable situation (such as a frequently occurring hazard, or lack of protective measures). If there is no hazard source present in the study area,

Risk Criteria		Industry	Transport dangerous goods	Tropical cyclones	Flooding	Wildfires	Volcano	Earthquake	Landslide	Tsunami
Presence	0-5	5	5	5	5	5	5	5	5	5
Intensity	1-5	5	5	5	5	5	5	5	5	5
Frequency	1-5	5	5	5	5	5	5	5	5	5
Elements at Risk	1-5	5	5	5	5	5	5	5	5	5
Vulnerability	1-5	5	5	5	5	5	5	5	5	5
Knowledge of Risk	1-5	1	5	5	5	5	5	5	5	5
Prevention	1-5	5	5	5	5	5	5	5	5	5
Protection	1-5	5	5	5	5	5	5	5	5	5
Emergency Planning	1-5	5	5	5	5	5	5	5	5	5
Resilience	1-5	5	5	5	5	5	5	5	5	5

Figure 1: Multi-hazard matrix.

the user will set the presence criterion to zero (0), indicating "absence" of any hazard source. The Multi-Hazard Matrix is represented as in Fig.1.

The Multi-Hazard Matrix is an information tool that can be used by community, stakeholders, industry, and local institutions to indicate which sort of hazard a community is exposed to. The methodology used presents sophistication on the risk conception because it also considers the community information and knowledge degree of the risk that it is exposed to, the predictability of the impact, the size of the community, among other factors that are not contemplated on the simplified mathematical expression that represents risk. The matrix is filled out according to the values obtained through the CRP tool which has a spread sheet with several questions for each risk criterion.

# **3 COMMUNITY RISK PROFILE TOOL**

According to CRP Tool guide, the CRP was developed to provide communities with a means of making a rough estimate of various types of risks they are exposed to, supporting the decision-making process, especially as to whether or not further assessments are needed. The CRP tool is not, therefore, a risk assessment tool. It is a tool that will provide users with a qualitative approach to characterize an expected level of risk and thus decide on the necessity for further assessment. It is also a tool that can be used to support awareness raising and capacity-building activities. It was designed for a range of users involved in risk assessment or community management, with a focus on local authorities responsible for disaster-related issues and land-use planning, as well as on insurers and aid agencies wishing to investigate risk in a given community area. Industry too will find parts of the relevant CRP tool. The CRP is produced automatically once the answers are being provided to the questions in the various spreadsheets. Each hazard identified and each criterion considered in the Multi-Hazard Matrix has a spreadsheet with specific questions to help characterize the risks associated with the different types of hazards. Each specific question is related to a mathematical equation, generally based on arithmetic average or on probability theory. Once the questions are answered, the equations calculate automatically a score for the criterion measured on a scale of 0 ("absence" of any hazard source) to 5.

When a hazard source is present, the presence of criterion is set to 5 and all of the other criteria are then assessed on a scale of 1 to 5, indicating a favorable or unfavorable situation. The CRP tool is an excellent resource to obtain a detailed situation of a community. It specifically highlights the vulnerabilities of the community under study. When we have a scenario where several communities are potentially exposed to hazards, the governments set investment priorities according to the needs. A simple comparison of CRP spreadsheets does not faithfully rate the communities due to the following reasons:

- Most of the questions are answered in a deterministic way (crisp). Thus questions like: "Is the community in a coastal area?" and "Is there warning in case of flood?" have "yes" or "no" as answers, not taking into account the distance from the community to the coast or the amount of alarms distributed in the community. In this manner, two communities will have the same risk score, regardless their actual distance to the sea or the number of alarms.
- The questions included in the same risk criterion have the same importance in the calculation, regardless their relevance. The following question: "Is the region or the upstream area subject to intense rain episodes?" Has the same weight than the question "Are parts of the upstream soil naturally impervious?" In this case, it is necessary to assign weights for a better assessment.

• The final result for each criterion reaches the maximum value of 5; however, when the values of each question in the spread sheet are added, this value is exceeded, but automatically reduced to 5, distorting the result.

For community rating, according to their degree of exposure to risks, a more realistic approach in terms of comparison of risk criteria is needed. To this end, using a tool with Fuzzy Logic can solve the above-mentioned problems in a simplified manner.

### 4 COMMUNITY RISK FUZZY MODEL

The concepts and information presented by the Multi-Hazard Matrix and the need of a more realistic community comparison encouraged the development of the CRFM tool, which provides an indicator for measuring the level of risk protection (PRL) identified in a community. The CRFM tool allows comparing different communities exposed to the same type of risk and rate them from the most to the less severely affected.

The CRFM tool can be used to guide the authorities on their decision on where and how to spend the available resources to mitigate or, if possible, eliminate the identified risk. In this study, we considered just one column of the UNEP Multi-Hazard Matrix (flooding), i.e., just one kind of risk. All criteria were assessed using Fuzzy Logic.

#### 4.1 The problem

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The CRFM tool developed in the present paper analyses particularly flooding. This risk was chosen because every year about 195 million people in more than 90 countries, including Brazil, are exposed to catastrophic flooding. According to APELL manual, of all natural disasters, floods affect the highest number of persons in the world and have the greatest potential to cause damages. When floods occur in less developed countries, they can result in thousands of deaths and lead to epidemics and also effectively end with decades of investment in infrastructure, seriously undermining economic prosperity.

To evaluate the CRFM tool, we simplified the CRP spreadsheet on flooding, reducing it to 20 questions considered essential for experts on the Brazilian scenario. The proposed model was based on Fuzzy Logic, which allows a more realistic evaluation. Each question corresponds to a Risk Factor (RF).

#### 4.2 Fuzzy relations

The leading theory in quantifying uncertainty in scientific models from the late nineteenth century until the late twentieth century had been probability theory. However, the gradual evolution of the expression of uncertainty using probability theory was challenged, first in 1937 by Max Black, with his studies in vagueness, then with the introduction of fuzzy sets by Lotfi Zadeh in 1965. Zadeh's work had a profound influence on the thinking about uncertainty because it challenged not only probability theory as the sole representation for uncertainty, but also the very foundations upon which probability theory was based: classical binary (two-valued) logic [6].

Fuzzy Logic is a powerful tool to solve complex problems due to its ability to infer conclusions and produce answers based on vague, ambiguous and/or qualitatively incomplete or inaccurate information. In this respect, Fuzzy-based systems can reason similarly to human brain. Its behavior is represented in a natural and simple way, leading to the construction of understandable systems of easy maintenance.

Traditionally, a logic proposition has two extremes: "totally true" or "totally false". However, in Fuzzy Logic, a premise varies in degrees of truthfulness from 0 to 1, leading to be "partially true" or "partially false". In the Fuzzy set theory, the groups are qualitatively labeled; using linguistic variables instead of numerical variables and the elements of such sets are characterized varying the degree of membership (value between 0 and 1 that indicates the degree to which an element belongs to the set). The models based on Fuzzy Logic do not substitute the models based on traditional logic, or the probabilistic models. Indeed, every "crisp" set is contained in a fuzzy set, but the opposite is not true. The introduction of the Fuzzy Logic enables the model to use qualitative and quantitative variables simultaneously and to generate quantitative results from qualitative data [7].

According to Zadeh [8], the greater the complexity of a system, the greater its efficiency in Fuzzy Logic, putting at a disadvantage other methods that cannot be modeled from inaccurate or ambiguous information. Fuzzy Logic was applied in the hierarchy model developed by Cosenza [9] which allows generating objective results from the simultaneous use of qualitative and quantitative variables. This model, although initially developed as a support tool in decision making in industrial location problems, was adapted in this study for the CRFM tool, to rate communities under risk of flooding.

## 5 CRFM METHODOLOGY

CRFM will depend on a set of inputs given by experts which are: definition of RFs and their relevance; determination of risk levels and RF rating in the communities.

5.1 Definition of risk factors and their relevance

To prepare the RF questionnaire, 20 questions were selected from the CRP spreadsheet to evaluate the tool based on the Brazilian reality. The experts assigned a degree of relevance to each selected question, as follows:

- Crucial (Cr) The community may be seriously affected.
- Conditioning (Co) The community may suffer significant damage.
- Little Conditioning (LC) Minor damage.
- Irrelevant (Ir) the community will hardly suffer damage.

The choice of four degrees of relevance (Cr, Co, LC, Ir) prevents the human tendency of choosing the central position when in doubt, impairing true judgment. The 20 RFs and their respective degrees of relevance are described:

- RF1 Is the community in a river valley? Cr
- RF2 Is the community located in a steep river basin? Cr
- RF3 Is the community in a coastal area? Co
- RF4 Is the community located below the water level of a large water reserve (lake or sea) contained by a dike or a dam? Cr
- RF5 Is the community in an urban area (with large artificial impermeable surfaces)? Cr
- RF6 Is the region or the upstream area subject to intense rain episodes? Cr
- RF7 Is the region or the upstream area subject to long periods of rain? Cr
- RF8 Are parts of the upstream soil naturally impervious? LC
- RF9 Has part of the upstream area been made impervious? (e.g. by building or paving the ground)? LC

- RF10 Has upstream soil retention capacity been reduced by the removal of vegetation (e.g. for agricultural purposes or to provide fire wood)? LC
- RF11 Are parts of the city able to concentrate the water during heavy rain? (roads or street forming a canyon) Co
- RF12 Is part of the upstream area reserved for expansion fields (using empty areas as retention areas)? LC
- RF13 Is the river bed properly managed (i.e. cleared of materials that could form obstacles to flow)? Cr
- RF14 Are buildings equipped to prevent flooding from the wastewater network? LC
- RF15 What is the human density of the area at risk? Co
- RF16 Has the community been flooded in the past? Co
- RF17 Is there warning in the case of flood? Cr
- RF18 Are there flooding emergency response plans? Co
- RF19 Have areas of public health concern been identified? Co
- RF20 Are there sufficient shelters available if evacuation becomes necessary? Cr

The RF set and their respective degrees of relevance may be modified according to the convenience of each decision maker. The model is flexible and allows incorporating or excluding factors.

## 5.2 Risk factor determination

This classification will rank the communities observing the requirements to counter the risk. These requirements were established by experts who determined four risk levels for the communities:

- Exceeds (A) optimal conditions to counter the risk.
- Meets (B) good conditions to counter the risk.
- Insufficient (C) bad conditions to counter the risk.
- None (D) no conditions to counter the risk.

Dimensions and linguistic terms were established for each RF. This classification will clarify the leveling from the best to the worst scenario, i.e., from a situation of little risk to a situation of high risk:

## 5.3 Risk factor classification in the communities

In this paper, the tool was evaluated in the following neighbourhoods: Praça da Bandeira and Rio das Pedras in the city of Rio de Janeiro and Campos Elíseos in Duque de Caxias, all of them inside the hydrographical region of the Guanabara Bay, where the major flooding events and the highest population concentration are [10]. The chosen communities were compared with Table 1 and the RF ranges within which they are placed were determined. Table 2 shows the RFs and their relevance (Rel) and their rating in the communities (A – exceeds, B – meets, C – insufficient, and D – none):

From this point, the degrees of membership of each community for each RF will be increased or penalized according to the degree of relevance and the rating of the RF for the community. The membership matrix obeys the hierarchy model developed by Cosenza as given in Table 3.

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RF	Unit	Exceeds (A)	Meets (B)	Insufficient (C)	None (D)
RF1	Km	≥5	2< × <5	0.5< x <2	≤0.5
RF2	Km	≥5	2< × <5	0.5< × <2	≤0.5
RF3	Km	≥5	2< × <5	0.5< × <2	≤0.5
RF4	Km	≥5	2< × <5	0.5< × <2	≤0.5
RF5	Km <sup>2</sup>	≤20	$20 < \times \le 30$	$30 < \times \le 40$	>40
RF6	intense rain/year	<3	$3 \le x \le 4$	$5 \le x \le 6$	>6
RF7	long rain/year	<3	$3 \le x \le 4$	$5 \le x \le 6$	> 6
RF8	%	<20	$20 \le \times \le 30$	$30 < \times \le 50$	>50
RF9	%	<20	$20 \le \times \le 30$	$30 < \times \le 50$	>50
RF10	$M^2$	<5000	$5000 \le \times \le 8000$	$8000 < x \le 10\ 000$	>10 000
RF11	unit	<1	$1 \le x \le 2$	$2 < \times \leq 4$	>4
RF12	%	>30	$20 < \times \le 30$	$10 \le x \le 22$	<12
RF13	maintenance/year	>3	3	<3	0
RF14	%	>50	$20 < \times \le 50$	$10 \le x \le 20$	<10
RF15	people/Km <sup>2</sup>	<12	$10 \le \times \le 22$	22< × ≤30	>30
RF16	unit	<1	$1 \le x \le 3$	$4 \le x \le 5$	>5
RF17	alarms/Km <sup>2</sup>	>3	$2 \le x \le 3$	1	0
RF18	linguistics terms	Exceeds	Meets	Insufficient	None
RF19	unit	0	$1 \le x \le 3$	$4 \le x \le 5$	>5
RF20	unit	>3	$2 \le x \le 3$	1	0

Table 1: Dimensions.

Table 2: Communities.

RF	Rel	Praça da Bandeira	Rio das Pedras	Campos Elíseos
RF1	Cr	D	А	С
RF2	Cr	С	С	А
RF3	Co	А	А	А
RF4	Cr	В	А	А
RF5	Cr	D	С	D
RF6	Cr	D	С	В
RF7	Cr	D	С	С
RF8	LC	D	В	В
RF9	LC	С	В	С
RF10	LC	В	В	С
RF11	Со	D	С	D
RF12	LC	С	D	D
RF13	Cr	С	В	D
RF14	LC	В	D	D
RF15	Со	D	D	D

(Continued)

Rel	Praça da Bandeira	Rio das Pedras	Campos Elíseos			
Co	D	D	D			
Cr	А	А	В			
Co	А	А	D			
Co	В	С	С			
Cr	А	А	В			
	Rel Co Cr Co Co Cr	RelPraça da BandeiraCoDCrACoBCrA	RelPraça da BandeiraRio das PedrasCoDDCrAACoBCCrAA			

Table 2: Continued.

Table 3: Membership matrix.					
	А	В	С	D	
Cr	1 <b>+</b> 4/n	1	1 – 4/n	0	
Co	1 + 3/n	1	1 – 3/n	1/(n – 16)!	
LC	1 + 2/n	1	1 – 2/n	1/(n - 17)!	
Ir	1 + 1/n	1	1 – 1/n	1/(n - 18)!	

Table 3: Membership matrix.

Table 4:	Result.

RF	Praça da Bandeira	Rio das Pedras	Campos Elíseos
RF1	0	1.2	0.8
RF2	0.8	0.8	1.2
RF3	1.15	1.15	1.15
RF4	1	1.2	1.2
RF5	0	0.8	0
RF6	0	0.8	1
RF7	0	0.8	0.8
RF8	0.17	1	1
RF9	0.9	1	0.9
RF10	1	1	0.9
RF11	0,04	0.85	0.04
RF12	0.9	0.17	0.17
RF13	0.8	1	0
RF14	1	0.17	0.17
RF15	0.4	0.4	0.4
RF16	0.4	0.4	0.4
RF17	1.2	1.2	1
RF18	1.15	1.15	0.4
RF19	1	0.85	0.85
RF20	1.2	1.2	1
PRL	17.14	13.11	13.38

Since n is equal to the number of RFs (20), the columns of the matrix will have the following degrees of membership:  $A = \{1.20; 1.15; 1.10; 1.05\}, B = \{1; 1; 1; 1\}, C = \{0.80; 0.85; 0.90; 0.95\}, D = \{0; 0.04; 0.17; 0.50\}.$  Column A has degrees of membership higher than 1, which is permitted by the model for a scenario that exceeds the expectations. Column B meets the expectations and has a degree of membership equal to 1. On the other hand, columns C and D, were penalized for not meeting the expectations and have degrees of membership lower than 1. The degrees of membership of the communities for each RF will be added to obtain the Level of Risk Protection (PRL) for the community as given in Table 4.

After adding all the degrees of membership of the 20 RFs for each community, the community that obtained the lowest PRL is the most exposed to risk of flooding and therefore, the one that needs more investment from the government to reduce the degree of each RF and improve the population preparedness and resilience.

#### 5.4 Analysis of Results

When we analyze the results of the CRFM tool applied to the three communities, we note that the neighboorhood Praça da Bandeira obtained the highest PRL (17,14), while the Rio das Pedras community obtained the lowest (13,11), practically tied with Campos Elíseos (13,38) indicating that these last two communities have higher flooding vulnerability. Implicitly, the tool showed that the region where the level of human development is higher (Praça da Bandeira), is better prepared to face the risk. On the other hand, poorer communities with low educational level need greater investments to improve their infrastructure and raise the awareness of their inhabitants.

#### 6 CONCLUSION

This study reviewed the importance of the APELL Programme of awareness and preparedness for emergencies at local level, that evaluates the communities by the Multi-Hazard Matrix, which is filled out by answering the questions in the CRP spreadsheet. The objective of this paper was to introduce a new tool that uses the Cosenza's Fuzzy Hierarchy Model, the CRFM that enables rating the communities exposed to risks.

The CRFM tool does not substitute the CRP spreadsheet. Using the Fuzzy Hierarchy Model in the communities with higher exposure to flooding risk led to a more realistic ranking process, identifying more fully and consistently the communities that require more investment. The Multi-Hazard Matrix continues to be filled by the CRP to assess the level of risk and vulnerability associated with the identified hazards. The results obtained through CRFM will depend on the following inputs: RFs considered in model structuring, importance assigned to those factors and the situation of the communities in face of the RFs. The opinion of experts is essential to ensure result reliability, because they are responsible for the model's inputs.

The CRFM tool was briefly introduced for the risk of flooding, but it can be used for all the risks in the Multi-Hazard Matrix and for all the RFs in the CRP spreadsheet. Model structuring makes it desirable preparing software that requires just to be provided with the inputs to give the result. Such software would greatly facilitate the application of CRFM, as well as simulating several situations where the environmental and structural conditions of a given community could be changed, which would be of interest of public managers to decide investment allocation and housing policies. The software would also make available a visual simulation to highlight the effects of a potential disaster.

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