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A conceptual framework of volcanic evacuation simulation of Merapi using agent-based model and GIS

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Abstract

In volcanic crises, the ability of population to evacuate has important role to reduce the risk. Based on two experiences of crisis management of Merapi 2006 and 2010, it was reported that there are problems in this aspect that caused confusion of population during the crises which resulted in fatalities. Therefore, we propose a methodology to develop a simulation model to analyze population risk that can be used to highlight the probabilities of emerged problem during the evacuation. The methodology of this research will be highly relied on the GIS-ABM simulation. The simulation was developed from the relation of the volcano, surrounding population and stakeholder within the environmental system. Those elements are represented as agents with their attributes, roles, behaviour and properties. As an example of the application, we developed a simulation case study using Anylogic.

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1. Introduction

The physical condition of Merapi environment that is suitable for farming and tourism attract people to stay in this area though it is prone to the volcanic disaster that result in problems when the eruption occur. It is identified that there are more than 50,000 people keep to live in the dangerous zone of Merapi although they experienced with several eruptions (Mei et al., 2013). Moreover, many people refuse the relocation policy although the volcanic eruption has damaged their settlements at 2010 (Ayuningtyas & Lele, 2013; Nuzulia & Sudibyakto, 2014).

During volcanic crises, the ability of population to evacuate has important role to reduce the risk, but problems are identified in this aspect. The expectation is that the populations at risk aware to make decision to evacuate themselves or to be evacuated during the crisis (Mei, Lavigne, Picquout, & Grancher, 2011). However, based on two experiences of crisis management of Merapi 2006 and 2010 (POSKO SET BAKORNAS PBP, 2006; Mei et al., 2013), populations confusion during the crises was still to be constraints on the evacuation processes which resulted in fatalities.

Evaluation of the evacuation plan based on the population behavior is necessary considering such previous problem to convince that it can be operated properly. As the goal of the plan is to save human lives from the volcanic impact, the effectiveness of the plan is measured from the ability to achieve the goal. However, currently, there is no enough method to measure this effectiveness until the plan is examined in the real disaster. As a consequence, it will be high speculation if in reality the plan is failed. In the critical time, it is potential to result fatalities.

Based on the explanation, it is important to develop simulations of the evacuation in the computer-based environment to identify the possible problems of the plan in various scenarios. This article is purposed to provide the conceptual framework of the development of simulation of volcanic evacuation using Agent-based Modeling and Geographic Information System (ABM-GIS). One of the advantages of using ABM for simulating real systems is that the real world can be experimented in-silico world without risks (van Dam, Nikolic, & Lukszo, 2012). To provide further explanation the rest of this article will provide the overview of related research, the conceptual framework followed by the application example using Anylogic and the conclusion.

2. Overview of Related Studies

As the most interesting volcano in Indonesia, Merapi has been explored in many researches from various point of views as well as the method/approach used. This research is ranged from physical aspect to social/human aspect. Physically, there are various studies that has been successfully explained the characteristic of hazard namely field study and hi-resolution imagery analysis (Charbonnier et al., 2013), field study and laboratory analysis (Damby et al., 2013), field study (de Bélizal et al., 2013), SAR (Bignami et al., 2013). Meanwhile, the existing research on social aspect are focusing on population responses, characteristics, perception or vulnerability (Christia, 2012; Donovan, 2010; Mei and Lavigne, 2012, Donovan, Suryanto, & Utami, 2012, Dove, 2008; Lavigne et al., 2008; Utami, 2008), influencing factor of evacuation decision (Sagala & Okada, 2009), evacuation management (Mei et al., 2013; Mei & Lavigne, 2013).

Based on many existing publications, there is no research that is focusing on evacuation modeling in Merapi, but there are plenty in the other geographic settings for various type of hazards. These studies can be categorized as macroscopic to microscopic models (Hamacher & Tjandra, 2001). Macroscopic models are mainly based on optimization approaches which does not consider the variability of the population in their decisions for selecting routes and destination (Hamacher & Tjandra, 2001). This model was applied for model development of evacuation GIS from flood (L. Yang, Liu, Yang, & Yu, 2015), volcanic eruption (Marrero, García, Llinares, Rodríguez-Losada, & Ortiz, 2010; Marrero et al., 2013), earthquake (Ye, Wang, Huang, Xu, & Chen, 2011). Meanwhile, microscopic models are based on simulation which is emphasized the individual parameters as well as the interactions between evacuees during evacuation operation (Hamacher & Tjandra, 2001). The example of this model is demonstrated using ABM for various hazard namely fire (Tan, Hu, & Lin, 2015), generic hazard (Nagarajan, 2014), tsunami (Mas, Suppasri, Imamura, & Koshimura, 2012), hurricane (Handford & Rogers, 2012), also using GIS for Generic hazard purpose (B. Yang, Ren, & Wu, 2012).

As explained, there are various techniques have been used to provide evacuation model of different type of hazards. However, the microscopic modeling for volcanic evacuation is not adequately explored. It is needed to be

specifically studied because volcanic hazard has different hazard characteristics. The time onset, for example, volcanic eruption is commonly started with some physical precursor whereas the other like earthquake is happened suddenly. The microscopic model are needed since there are high variability and uncertainties of the behaviors of people during an emergency situation (Mas et al., 2012).

To develop this non-linear model need appropriate approach. Nowadays, the agent-based model (ABM) is considered to be an adequate model to simulate such system (Malleon, See, Evans, & Heppenstall, 2014; Sribljinić & Škunca, 2003). ABM can be used to simulate the interaction between agents that it can be formed from social, economical or ecological factors (Šalamon, 2011). In the case of volcanic evacuation, the agents is not only the people at risk and their environment but also people/agencies who have roles in the evacuation planning such as communication (Birowo, 2010), mobilization (Mei et al., 2013), and transportation (Mei et al., 2013). Some NGO also has been involved in communicating the risk and mobilizing people (Birowo, 2010), we call it stakeholders.

On the other hand, spatial aspect of disaster needs to be considered in the model. Therefore, integration of GIS and ABM (Brown, Riolo, Robinson, North, & Rand, 2005) are considered to be appropriate. Although this idea is not a novel approach, its research growing has been slow developed (Gilbert, 2008). In this context, GIS provides framework of managing and visualizing spatial data of hazard extent, the population at risk as agents and their dynamic, whereas ABM provides better simulation social process of communication between the agents in disaster responses, their characteristics, and their behavior.

3. The Volcanic Evacuation Simulation Framework

3.1. Relation and Interaction of Agents

This framework will provide overview of the agent composition, their properties, roles and interaction that construct the volcanic hazard system. The description is provided from general of the relation to the detail of the modelling abstraction.

In general, the simulation is developed from the relation of the volcano and the surrounding population (Fig. 1). The existing of volcano can be advantageous for this population as well as can be a time bomb because of its activities. When the volcano become active, populations can observe the likelihood but can be difficult to make decisions due to their limitation of knowledge. Therefore, stakeholders, the authorities (government) in this case have significant role to observe and analyse the activities. Proper warnings should be issued by the authorities to alert population when the eruption likely happen. Populations who spatially located in the susceptible areas can be high risk from the impact at that time, so that evacuation should be conducted.

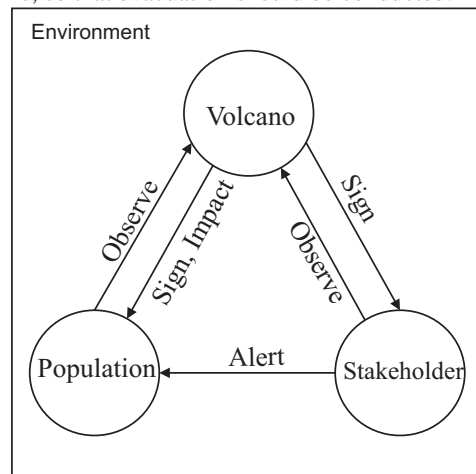


Fig. 1. The Relation of Volcano and Population in Disaster Context.

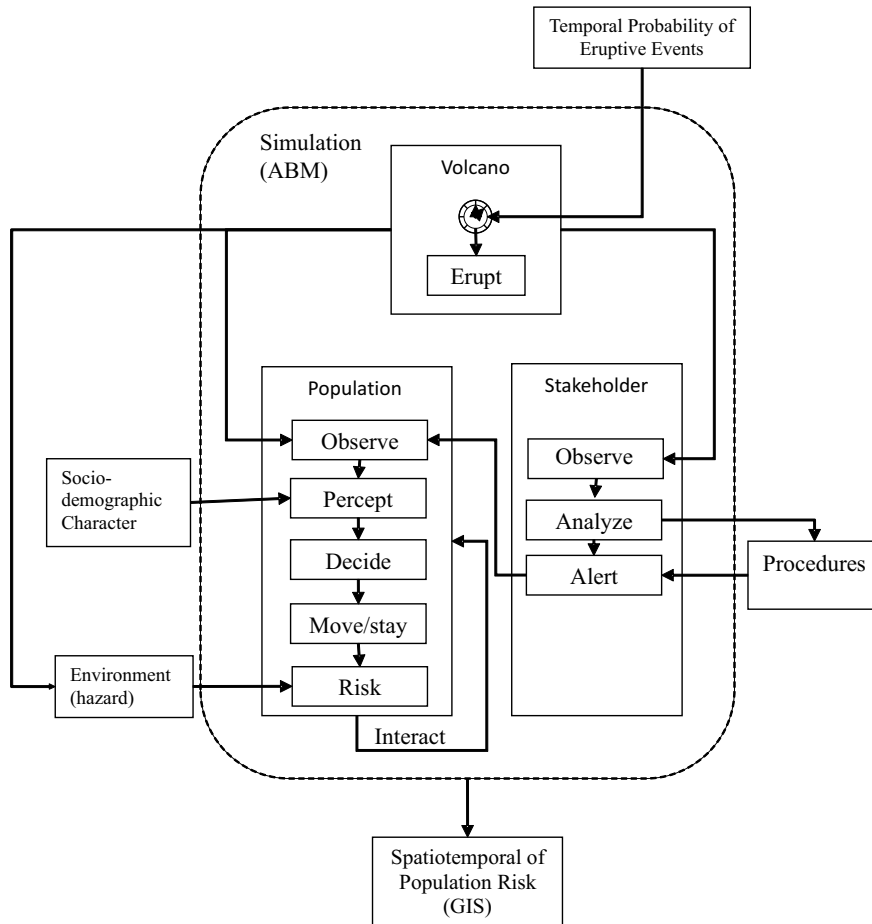


Fig. 2. Conceptual Framework of ABM Simulation.

In the ABM simulation, those three elements represented as agents which interact with the environment. Each agent has certain behavior and mechanism when interacting with the others as well as the environment (Figure 2). In this case, the mechanism is figured as statechart which describe the changing from one to another condition. The environment is represented in spatial data, with agent laid on this with specific geographic location.

Geographically, the location of the volcano as center of hazardous material will take important role in the result. The center of volcano (crater) can be interpreted from the topographic map or satellite imagery. Meanwhile, putting population with specific location which is can be high number individually is challenging. In this simulation, GIS analysis was conducted to prepare the center of the population distribution probability. The result of mean center (center of gravity) analysis (Levine, 1996) of settlement is used to distribute the population of each population unit. The randomness of the distribution of population within specific population unit with the center is generated in AnyLogic using triangular probability distribution (Borshchev, 2013).

3.2. Spatiotemporal Dynamic Setting

As the volcanic activities are dynamic in terms of the magnitude (VEI) and time-based activities, the risk of the area within the hazard zone (See BNPB, 2011) can be dynamic over time. Therefore, the relation of this should be defined well in the model (Table 1 and 2). This matrix can be used to categorize every condition that occur in the simulation as the interaction of various scenarios of VEI, days of crisis length and the extent of the hazard.

Table 1. Matrix Relation of Risk Level with Hazard Zone and Time-based Volcanic Activities.

Activity (time-based)	Low	Medium	High
Zone			
Low	Low	Low	Low
Medium	Low	Medium	Medium
High	Low	Medium	High

Table 2. Matrix Relation of Risk Level with Volcanic Explosivity Index (VEI) and Hazard Zone.

VEI	1	2	3	4
Zone				
High	High	High	High	High
Medium	Medium	Medium	High	High
Low	Low	Low	Low	Low

4. The Application Example

Based on the conceptual framework that described previously, agents, properties, rules was created in AnyLogic. The following figure describe the statechart of each agent whereas Fig. 3A is the stakeholder, Figure 3B is the volcano, and Figure 3C is the population. In this statechart, the individual perception has not implemented yet and will be developed in the future work.

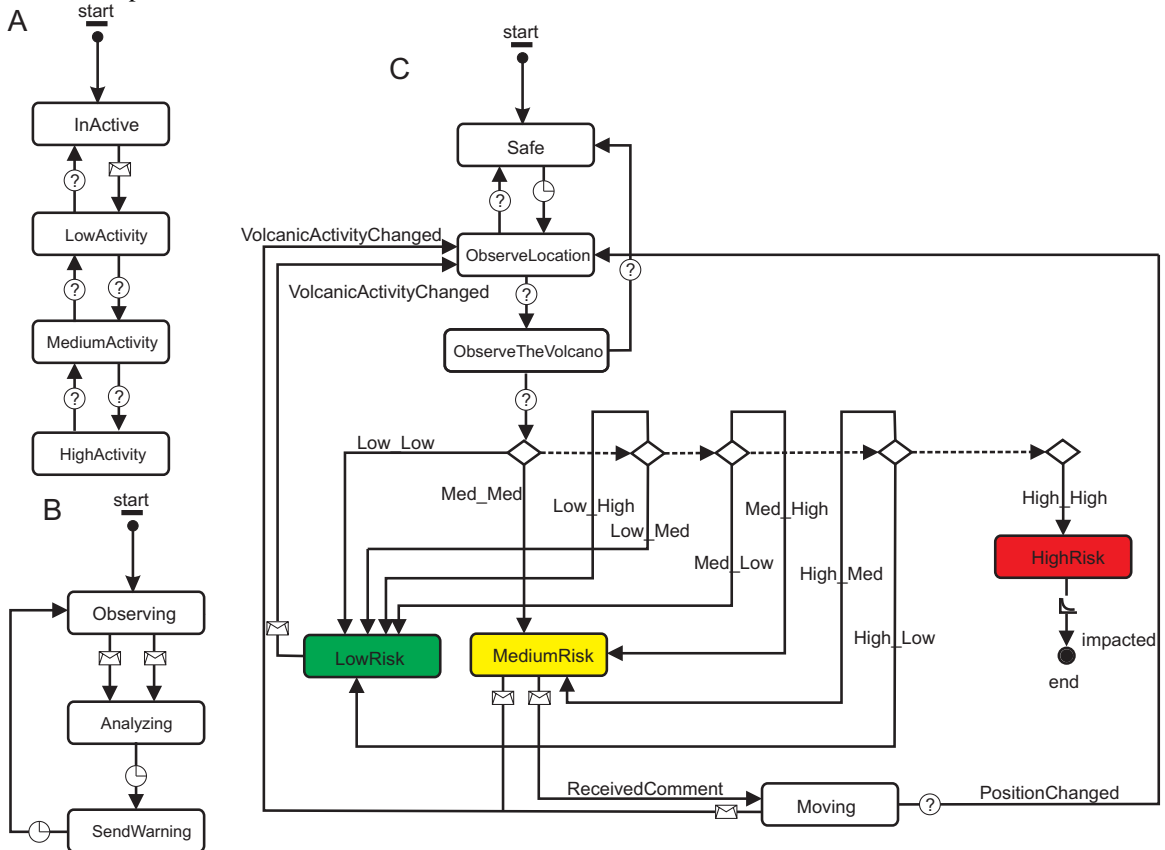
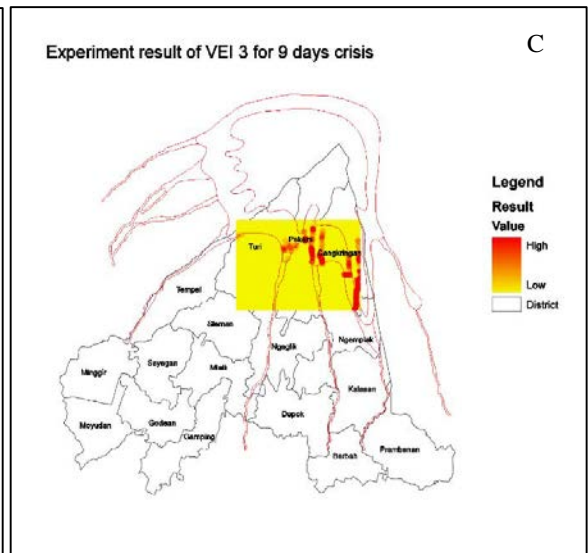
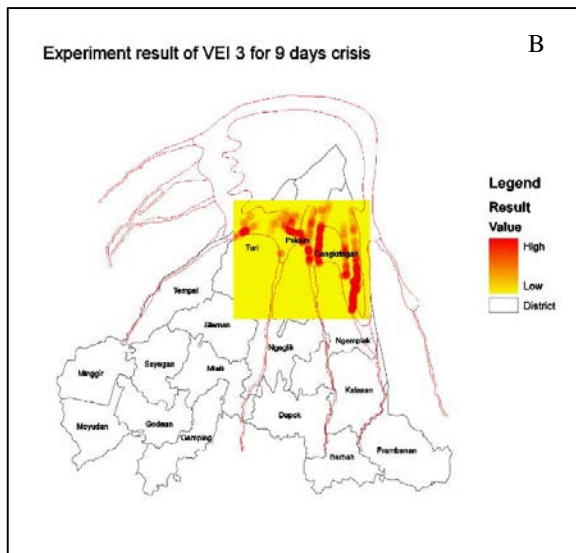
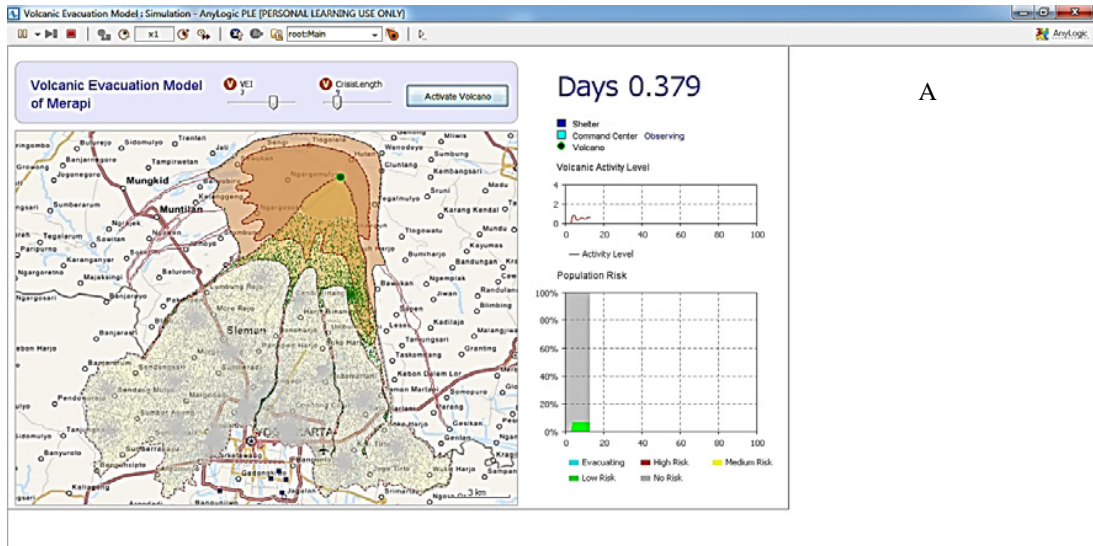


Fig. 3. Agents Statechart.

The result of the simulation (Fig. 4A) can be run from AnyLogic portal i.e. <http://www.runthamodel.com/models/k-RgpNLal0ojYE1To31FJa>. The limitation of this online version is that the route detail from OSM PBF file cannot be employed like offline version. Therefore, the result may differ with the reported result. Some experimentation examples from this model have produced for various scenarios of VEI. The possibly impacted population and the position can be saved as spatial data. Therefore, it can be analyzed. These result examples are provided in the Figure 4B - C. In this results, the population locations were analyzed using point density in ArcGIS to provide risk hotspot.



See: <http://www.runthamodel.com/models/k-RgpNLal0ojYE1To31FJa/>

Fig. 4. Application Example of Volcanic Evacuation Model using AnyLogic.

4. Conclusions

Population risk toward volcanic disaster has spatiotemporal aspect as results of the relation of several agents that can be modeled. Spatially, the risk extent as well as the magnitude can dynamically change over time. Therefore, we recommend that using simulation environment can provide a better understanding of the risk. However, the developed simulation in this article still need to be improved due to several limitation: (1) the variability of population behavior have not involved in this initial simulation development, it will be investigated in the fieldwork, (2) all actors which are involved in disaster management should be considered, (3) the temporal characteristic of volcanic activity during crisis need to be investigated from historical records.

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