

Labor Market in Multi-agent Environment Modeling Virtual Economy

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Abstract. The paper is focused on the detailed overview of the part of the virtual economy project (VEP) which is developed within the research program at the University of Hradec Kralove. The introduction is mainly about the principles of the multi-agent system and how the economic methods could be developed by this approach and related works. The VEP project is described to better understanding the author's motivation and continuity for the previous research. The practical part is focused to explain how exactly these principles are used in the VEP project (what methods and technologies were used, or what influences were not been taken into account). The paper provides the graphical samples of the labor market behavior displayed as sequences of the steps by state diagrams. For the verification of the right behavior of the labor market implementation, some tests were performed and the results were analyzed. The summarization of the measured results with the relation for the future research is described at the end of the paper.

Keywords: Agent, Virtual Economy, Labor Market, Agent-based Economic Model.

1 Introduction

The agent-based computational economies represent a bottom-up approach for developing economic systems, where is desired behavior achieved through the interaction of its individual components – agents [6]. In this paper, the main attention is focused on an overview of the labor market in an agent-based economic sandbox environment, currently under development at the Faculty of Informatics and Management of the University of Hradec Kralove.

1.1 Economy in Multi-Agent systems

The economic influence is the important part of the most of the models (agent-based, mathematics, evolutionary, experts...) [5] which is trying to simulate the behavior of the real world.

The popular area of the modeling economy in the virtual environment is Agent-based computational economics (ACE). Much of existing literature indicates that ACE is a powerful tool for the ex-ante analysis of market power, and consequently for

policymakers when evaluating structural changes and market policies. The area describes the individual economic subjects (i.e. labor market, consumer, provider...) as separate agents which can interact with each other according to its goals [4].

Gehrke in [3] explains the logistics as an important economic integral part of internal business processes which is crucial for efficient supply chain management and smooth business operation.

The Virtual Economy Project (VEP) is based on the principles of Agent-based computational economics.

2 Virtual Economy Project

The model described in this paper is a part of agent-based computational economics project “Virtual Economy Project” (VEP) which is primarily focused on the effective distribution of all types of products throughout the model [1].

The economic model does not aspire to be an all-inclusive real-world simulation. Some areas important for real-world economies have been deliberately omitted, like currency markets, stock market trading, many financial services, etc., in order to keep model viable and comprehensible. Although some level of abstraction was necessary, there has been on the other hand shown a considerable effort to utilize real statistical data (from sources like Czech Statistical Office, see www.czso.cz webpage) as much as it has been relevant and useful for the functions of the model. Also, although simplified for the same reasons as mentioned above, official classifications were used to classify model components/activities plausibly (e.g. CZ-NACE classification of economic activities or RAMON – Eurostat’s Classification Servers). This helped to clarify the model while maintaining a reasonable level of detail at the same time [8].

The model is developed on Anylogic developer tool which runs on the JAVA platform. There are several agents which represent economic entities:

Table 1. Agent’s overview of the Virtual Economy Project.

Agent	Description of behavior	Number of agents in model
Mine (MA)	Mining materials, distribute materials	200 – 2000
Factory (FA)	Ordering inputs, producing and distribute products to FA, SA	500 – 5000
Store (SA)	Ordering products, selling products to CA	50 – 1000
Consumer (CA)	Consume products, represent workforce	1000 – 500 000
Transport (TA)	Transport CA or products	50 - 10000
Company (CoA)	Own MA, FA, SA or TA. Planning company expansion	1 - 100
Broker (BA)	Manage markets – products, services, and labor	1 per city
City (CiA)	Area unit. Represent city and its services.	1 - 100

In the model, the indirect communication is used. This approach is used in trading with products or workforce. In principle, the agent needs to distribute the product

which was produced on the wholesale market. The order must be created in the standard form: name of product, amount, price and seller. This order is sent to facilitation agent Broker which decide what will be done next (add order on the wholesale or retail market) [7]. The principle of the communication is described in the picture below.

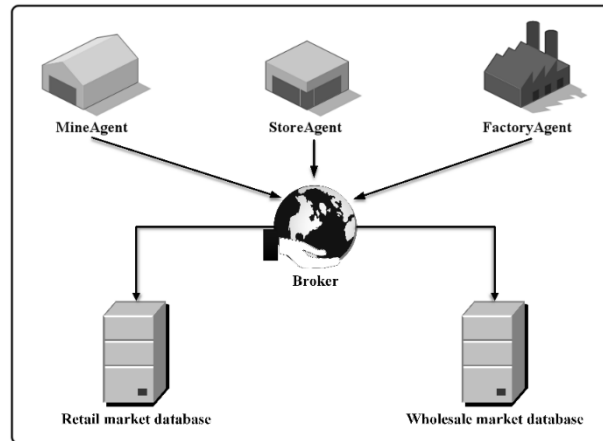


Fig. 1. The principle of indirect communication in the Virtual Economy Project.

The labor market will be implemented by the same principle as product markets. Before the implementation, the several questions need to be analyzed to choose the most appropriate option.

3 Implementation ways of the labor market

To implement the ways how the companies would hire the employees the main attributes of the consumer agents had to be defined:

Table 2. Consumer agent's attributes relating to the labor market.

Attribute	Description
Age	Only CA in productive age (15 – 65) should be employed
Specialization	CA prefers the workplace with its specialization.
City	CA prefers the workplace which is near to its permanent residence

The next important attribute for labor market area could be e.g. **efficiency** which could be calculated from attributes like experiences, education and if the CA works in its specialization field. This attribute is scheduled to be added to the future version of the VEP project.

Table 3. Workplace attributes relating to the labor market.

Attribute	Description
Salary	Salary for the specific workplace
Specialization	CA with the relevant specialization to the workplace will have a better chance to be employed than CA with other specialization.
City	CA prefers the workplace which is near to its permanent residence.

The companies prefer the employees in the relevant specialization – simple behavior of the hiring. Consumers prefer the workplace in its specialization field, near to its permanent residence and on the amount of the salary.

3.1 Datasets of the VEP relates with Labor market

The important part of the project is the verification of the appropriate datasets. The main statistics in the model are provided by the Czech Statistical Office [2].

The age of the consumers is calculated by the average values of the age limits:

Table 4. Age limits in the VEP project

Age limit	Age group name	% Consumers (CZ)
1 – 14	Child	15
15 - 65	Adult	65
66 +	Retired	20

The dispersion of the consumers by age is done at the start of the model by the simple function, where for each of the consumer agent the age is randomly calculated by the percent probability from the Table 4:

At first, the value from the random generator is used to determine to which age group the CA belongs (1 – 15 = Child, 16 – 80 = Adult, 81 – 100 = Retired). Then the age is set at the appropriate interval.

The next datasets based on the real data in VEP are e.g. gender distribution, the population of the specific cities or location of the cities on GIS map.

4 Experiments

For the verification of the right behavior of the age distribution and the relating hiring procedure, the simple experiments were performed.

4.1 Age distribution experiment

The purpose of this experiment was to ensure that the all of the age groups have the similar distribution as in the real. The experiment was performed on the total population of the 4 cities (which parameters were based on the real data) from the

Hradec Kralove region. These cities (Hradec Kralove, Trebechovice pod Orebem, Chlumec nad Cidlinou and Jaromer) have totally 116502 people (consumers). The results of the distribution from the 10 runs of the model are following:

Table 5. Age distribution in the VEP

Run	Childs	Childs ratio	Adults	Adults ratio	Retired	Retired ratio
1	17501	0,15	75675	0,65	23326	0,20
2	17447	0,15	76181	0,65	22874	0,20
3	17416	0,15	75866	0,65	23220	0,20
4	17493	0,15	75746	0,65	23263	0,20
5	17535	0,15	75561	0,65	23406	0,20
6	17504	0,15	75881	0,65	23117	0,20
7	17316	0,15	75746	0,65	23440	0,20
8	17321	0,15	75790	0,65	23391	0,20
9	17525	0,15	75775	0,65	23202	0,20
10	17469	0,15	75729	0,65	23304	0,20

From these results, it is clear that the age distribution function works properly in the VEP model. It was important to verify to get the right count of the consumers which could be used as the employees within the labor market area.

4.2 Hiring management experiment

This simple experiment verifies that the preferences of the companies (described in chapter three) are applied properly. The consumer's decision making will be more complex and will be used in the future research. For the test this companies and consumers were available:

Table 6. Companies in the VEP model within the hiring experiment

Company	Specialization	City
Butchery_1	1	Hradec Kralove
Butchery_2	1	Jaromer
Accounting_1	2	Hradec Kralove
Accounting_2	2	Jaromer

The companies are looking for the employees with the same specialization and the location of the consumer and company is not important for them. Within this strategy the results after applying hiring process in the model run were different.

Table 7. Consumers in the VEP model within the hiring experiment

Consumer	Specialization	City
Consumer_1	1	Hradec Kralove
Consumer_2	1	Jaromer
Consumer_3	2	Chlumec nad Cidlinou

Once the Consumer_1 was hired by Butchery_1, in the next run by Butchery_2 etc. In the main attribute, the results were always the same – specialization of the consumer was equal to the specialization of the company. It was not possible to hire e.g. Consumer_1 with specialization 1 by company Accounting_1 with specialization 2.

5 Conclusion

Presented simulations showed potential for testing more complex labor market behavior patterns in such virtual environments. The experiments were focused to verify if the standard and expected behavior work properly to start to implement complex algorithms. Future proceeding in the simulation will be focused on whole labor market process and its impact on the other areas (producing, transporting, trading...). Together with the involvement of more market participants, this is intended for the future work.

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