

# Modelling the sequential real options under uncertainty and vagueness (fuzzy-stochastic approach)

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## Abstract

The basic intention of the paper is to propose and verify the sequential real options model under vagueness conditions. The sequential real options are specific real option type. Sequential options are special type of generalised switch option. The sequential problems could be decomposed and solved as several subsequent stages. And subsequent value is underlying asset of the computed stage. Therefore, the sequential option model is compound options on the stages values. The input data uncertainty and vagueness in a form of fuzzy-stochastic distribution function is considered. Sequential fuzzy-stochastic model is proposed. Illustrative example is presented.

**Keywords:** Real options; Switch option; Discrete Binomial Model; Stochastic Dynamic Programming; Sensitivity analysis; Fuzzy-stochastic model; Fuzzy number

**JEL Classification:** C6, C 44, C53, F2, F21, G1, G11, G15, G2, G21

**AMS Classification:** 91B25, 91G20, 91G50, 91G60, 91G80

## 1 Introduction

The real options methodology could be considered to be a generalised approach encompassing risk and flexibility aspects simultaneously in a valuation. We can present publications concerning real options, see e. g. [9], [17], [20], [27], [28], [29], [1], [5], [6], [7], [8], [10], [13]. Relatively new topic of option valuation are fuzzy-stochastic models, examples of papers are e.g. in [25], [26], [22], [23], [2], [3], [4], [19], [21], [15], [16], [17], [24], [28], [29], [30], [31], [32], [33], [14], [17], [11].

Basic approach of valuation under complete market is the replication strategy and no-arbitrage principle using the risk-neutral probability and general principle is the martingale approach. Owing to the economic assets types, random processes complexity and decisions variables and functions, the real options are largely of the American options type, discrete binomial (multinomial) models, with multinomial options to switch. Sequential options are a special type of switching options modelling being a generalised approach of real options modelling. Sequential real options are irreversible and state (phase) options applied especially in the investment decision process, construction; see e.g. [20], [30], [31], [32]. The investment (switching) cost is influential input parameter of sequential option valuation. A sensitivity of the value and results are the important aspect of the decision-making and analysis.

The intention of the paper is to analyse the possibilities of the sensitivity of the sequential options value on the investment cost. The fuzzy-stochastic approach is investigated. Methodology and notation is derived and linked to the papers of [26], [31], [32].

## 2 Valuation procedure of an American sequential option with switching cost

The sequential problems could be decomposed and solved as several subsequent stages. And subsequent value is underlying asset of the computed stage, see Fig. 1.

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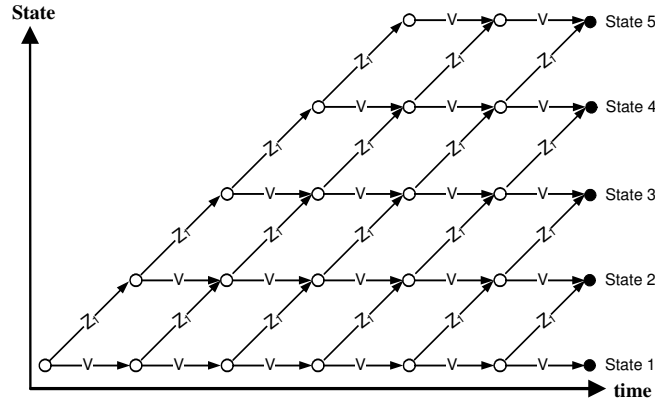


Figure 1 Sequential real option presentation

Therefore, problem is in detail a compound option on the stages values. In every stage there are only two decision possibilities: go to subsequent stage  $m-1$  or to stay in stage  $m$ . Applying notation in [31] the sequential options valuations equations are following.

$$V_N^m = \max \left[ x_0^{m-1} - C_{m,m-1} + \beta \cdot \widehat{E} \left( V_{N-1}^{m-1} \right); x_0^m + \beta \cdot \widehat{E} \left( V_{N-1}^m \right) \right], \quad (1)$$

$$V_{N-k}^m = \max \left[ x_k^{m-1} - C_{m,m-1} + \beta \cdot \widehat{E} \left( V_{N-1-k}^{m-1} \right); x_k^m + \beta \cdot \widehat{E} \left( V_{N-1-k}^m \right) \right], \quad (2)$$

$$V_1^m = \max \left[ x_{N-1}^m + \beta \cdot V_0^m \right] \quad (3)$$

Here  $V_{N-k}^m$  is value for  $N-k$  periods to final period and  $x_k^{m-1}$  is cash flow in the particular period  $k$  and stage  $m-1$ ,  $C_{m,m-1}$  are investment (switch) cost from stage  $m$  to  $m-1$ ,  $\beta_t = (1+R)^{-t}$  is discount factor,  $\widehat{E} \left( V_{N-1-k}^q \right)$  is risk-neutral expected value of subsequent stage and  $N-k-1$  is time to final stage.

## 2.1 Sequential option valuation procedure description

Valuation procedure of sequential options with investment cost reflecting the stochastic dynamic programming on the Bellman's principle expressed by recurrent equations, under the discrete binomial model and risk-neutral probability and geometric Brown motion is possible to describe in following steps.

- The determination of the risk-neutral growth parameter  $\widehat{g}$ .
- Cash flow modelling so as an underlying asset. Subjective approach by virtue of expert estimation and forecast. Objective approach on the basis of statistical estimation and forecasting of random process. In the case of Brown's geometrical process due to Cox, Ross, Rubinstein (1979) calibration,

$$x_{t+1,s+u}^u = x_{t,s} \cdot U; \quad x_{t+1,s+d}^d = x_{t,s} \cdot D. \quad \text{Here } U = e^{\sigma \cdot \sqrt{dt}}, \quad D = e^{-\sigma \cdot \sqrt{dt}}.$$

- At the beginning of the last phase the value for the last phase is  $V_{1,s}^q$ , here  $s$  is state and  $q$  is mode.
- By backward recurrent procedure from the end of binomial tree to the beginning for states  $s$  and modes  $q$  of particular period in accordance with the generalised recurrent Bellman's stochastic equations (1), (2), (3) correspondingly values are calculated. Here  $\widehat{p}$  is risk-neutral probability of up movement and  $\widehat{q} = 1 - \widehat{p}$  is risk-neutral probability of down movement. Valuation formula for the last phase,

$$V_1^m = \max \left[ x_{N-1}^m + \beta \cdot V_0^m \right].$$

Valuation formula for other periods by virtue of the recurrent procedure,

$$V_{N-k}^m = \max \left[ x_k^{m-1} - C_{m,m-1} + \beta \cdot \widehat{E} \left( V_{N-1-k}^{m-1} \right); x_k^m + \beta \cdot \widehat{E} \left( V_{N-1-k}^m \right) \right].$$

Valuation formula at the beginning of the whole first phase (the first period),

$$V_N^m = \max \left[ x_0^{m-1} - C_{m,m-1} + \beta \cdot \widehat{E} \left( V_{N-1}^{m-1} \right); x_0^m + \beta \cdot \widehat{E} \left( V_{N-1}^m \right) \right].$$

e) Identification of the decision variant for state  $s$  and time  $t$ ,  $Q_{t,s}$ ,

$$Q_{t,s} = \arg \max_{q \in S} \left( x_k^{m-1} - C_{m,m-1} + \beta \cdot \bar{E}(V_{N-1-k}^{m-1}) \cdot x_k^m + \beta \cdot \bar{E}(V_{N-1-k}^m) \right).$$

f) The implementation of the sensitivity analysis concerning the input data.

### 3 Fuzzy-stochastic elements

For application of fuzzy-stochastic methodology the crucial terms are fuzzy number, fuzzy operations and decomposition principle. A fuzzy set meeting preconditions of normality, convexity, continuity with the upper semi-continuous membership function and closeness and being depicted as the quadruple  $\tilde{s} = (s^L, s^U, s^\alpha, s^\beta)$ , where  $\phi(x)$  is a non-decreasing function and  $\psi(x)$  is a non-increasing function, is called the  $T$ -number. Let us denote the set of  $T$ -numbers on  $n$ -dimensional Euclidean space  $E$  by  $F_T(E)$ .  $T$ -number is defined as follows,

$$\tilde{s} \equiv \mu_{\tilde{s}}(x) = \begin{cases} 0 & \text{for } x \leq s^L - s^\alpha; \phi(x) & \text{for } s^L - s^\alpha < x < s^L; \\ 1 & \text{for } s^L \leq x \leq s^U; \psi(x) & \text{for } s^U < x < s^U + s^\beta; \\ 0 & \text{for } x \geq s^U + s^\beta \end{cases}.$$

The  $\varepsilon$ -cut of the fuzzy set  $\tilde{s}$ , depicted  $\tilde{s}^\varepsilon$ , is defined as follows.  $\tilde{s}^\varepsilon = \{x \in E; \mu_{\tilde{s}}(x) \geq \varepsilon\} = [-s^\varepsilon, +s^\varepsilon]$  where  $-s^\varepsilon = \inf\{x \in E; \mu_{\tilde{s}}(x) \geq \varepsilon\}$ ,  $+s^\varepsilon = \sup\{x \in E; \mu_{\tilde{s}}(x) \geq \varepsilon\}$ .

Application of the Decomposition principle for a function of fuzzy numbers allows expressing the selected fuzzy operations  $\tilde{*}$  among fuzzy numbers directly, as follows:  $\tilde{w} = \tilde{s} \tilde{*} \tilde{r} = \bigcup_{\varepsilon} \mathcal{E}(w^\varepsilon) = \bigcup_{\varepsilon} \mathcal{E}(s^\varepsilon * r^\varepsilon)$ .

Fuzzy addition  $s^\varepsilon + r^\varepsilon = [-s^\varepsilon + -r^\varepsilon; +s^\varepsilon + +r^\varepsilon]$ .

Fuzzy subtract  $s^\varepsilon - r^\varepsilon = [-s^\varepsilon - +r^\varepsilon; +s^\varepsilon - -r^\varepsilon]$ .

Fuzzy scalar product  $k \cdot s^\varepsilon = [k \cdot -s^\varepsilon; k \cdot +s^\varepsilon]$  for  $k \geq 0$ ,  $k \cdot s^\varepsilon = [k \cdot +s^\varepsilon; k \cdot -s^\varepsilon]$  for  $k < 0$ .

Fuzzy multiplication  $s^\varepsilon \cdot r^\varepsilon = [-s^\varepsilon \cdot -r^\varepsilon; +s^\varepsilon \cdot +r^\varepsilon]$  for  $\tilde{s} > 0, \tilde{r} > 0$ ,

$s^\varepsilon \cdot r^\varepsilon = [-s^\varepsilon \cdot +r^\varepsilon; +s^\varepsilon \cdot -r^\varepsilon]$  for  $\tilde{s} < 0, \tilde{r} > 0$ ,  $s^\varepsilon \cdot r^\varepsilon = [+s^\varepsilon \cdot +r^\varepsilon; -s^\varepsilon \cdot -r^\varepsilon]$  for  $\tilde{s} < 0, \tilde{r} < 0$ .

Fuzzy division  $s^\varepsilon : r^\varepsilon = [-s^\varepsilon : +r^\varepsilon; +s^\varepsilon : -r^\varepsilon]$  for  $\tilde{s} > 0, \tilde{r} > 0$ ,  $s^\varepsilon : r^\varepsilon = [+s^\varepsilon : +r^\varepsilon; -s^\varepsilon : -r^\varepsilon]$  for  $\tilde{s} < 0, \tilde{r} > 0$ ,

$s^\varepsilon : r^\varepsilon = [+s^\varepsilon : -r^\varepsilon; -s^\varepsilon : +r^\varepsilon]$  for  $\tilde{s} < 0, \tilde{r} < 0$ .

Fuzzy max,  $\max(s^\varepsilon) = [\max -s^\varepsilon; \max +s^\varepsilon]$ .

Here  $\tilde{s} > 0$  is positive fuzzy number, positive  $\tilde{s} : \{x; \text{for which } \mu_{\tilde{s}} \geq 0\}$  and simultaneously  $x \in E^+$  (set of positive numbers), negative  $\tilde{s} : \{x; \text{for which } \mu_{\tilde{s}} \geq 0\}$  and simultaneously  $x \in E^-$  (set of negative numbers). *Decomposition principle* (Resolution identity) is defined as follows,  $\mu_{\tilde{s}}(y) = \sup_{\varepsilon} \{\varepsilon \cdot I_{\tilde{s}^\varepsilon}; y \in \tilde{s}^\varepsilon\}$  for any

$y \in E$  and  $\varepsilon \in [0;1]$ , where  $\tilde{s}^\varepsilon = [-s^\varepsilon, +s^\varepsilon]$  is  $\varepsilon$ -cut,  $y = f(x)$ ,  $-s^\varepsilon(x) = \min_{x \in \tilde{s}^\varepsilon \subset E} f(x)$ ,  $+s^\varepsilon(x) = \max_{x \in \tilde{s}^\varepsilon \subset E} f(x)$ .

Here  $I_{\tilde{s}^\varepsilon}$  is the characterisation function,  $I_{\tilde{s}^\varepsilon} = \{1 \text{ if } y \in [-s^\varepsilon, +s^\varepsilon]; 0 \text{ if } y \notin [-s^\varepsilon, +s^\varepsilon]\}$ .

### 4 Fuzzy-stochastic sequential real option model

There is several variants of the fuzzy input data: partial fuzzy input data (investment cost, volatility (up index, down index), underlying asset, risk free –rate), full fuzzy input data (every parameters are in fuzzy values given). We can generally express, applying the decomposition principle,  $\varepsilon$ -cut of fuzzy number  $\tilde{f}_t$ , composed from two fuzzy numbers  $\tilde{G}_t$  and  $\tilde{H}_t$  by relation fuzzy maximization, as follows,

$$[f_t^\varepsilon] = \max[G_t^\varepsilon; H_t^\varepsilon] = \max\left[(-G_t^\varepsilon; -H_t^\varepsilon); (+G_t^\varepsilon; +H_t^\varepsilon)\right] = \left[\max(-G_t^\varepsilon; -H_t^\varepsilon); \max(+G_t^\varepsilon; +H_t^\varepsilon)\right] = [-f_t^{\varepsilon-}; +f_t^{\varepsilon+}].$$

Here  $-f_t^{\varepsilon-} = \max(-G_t^\varepsilon; -H_t^\varepsilon)$ ,  $+f_t^{\varepsilon+} = \max(+G_t^\varepsilon; +H_t^\varepsilon)$ . And  $-G_t^\varepsilon = \min G_t^\varepsilon$ ,  $-H_t^\varepsilon = \min H_t^\varepsilon$ , furthermore  $+G_t^\varepsilon = \max G_t^\varepsilon$ ,  $+H_t^\varepsilon = \max H_t^\varepsilon$ .

Applying previous common fuzzy maximization relation with fuzzy investment (switch) cost, we can formulate following recurrent formulas,

$$(V_N^m)^\epsilon = \left[ -(V_N^m)^\epsilon; +(V_N^m)^\epsilon \right], \tag{4}$$

where  $-(V_N^m)^\epsilon = \max \left[ x_0^{m-1} - C_{m,m-1}^\epsilon + \beta \cdot \widehat{E}(V_{N-1}^{m-1}); x_0^m + \beta \cdot \widehat{E}(V_{N-1}^m) \right]$  and

$$+(V_N^m)^\epsilon = \max \left[ x_0^{m-1} - C_{m,m-1}^\epsilon + \beta \cdot \widehat{E}(V_{N-1}^{m-1}); x_0^m + \beta \cdot \widehat{E}(V_{N-1}^m) \right];$$

$$(V_{N-k}^m)^\epsilon = \left[ -(V_{N-k}^m)^\epsilon; +(V_{N-k}^m)^\epsilon \right], \tag{5}$$

where  $-(V_{N-k}^m)^\epsilon = \left[ x_k^{m-1} - C_{m,m-1}^\epsilon + \beta \cdot \widehat{E}(V_{N-1-k}^{m-1}); x_k^m + \beta \cdot \widehat{E}(V_{N-1-k}^m) \right]$  and

$$+(V_{N-k}^m)^\epsilon = \max \left[ x_k^{m-1} - C_{m,m-1}^\epsilon + \beta \cdot \widehat{E}(V_{N-1-k}^{m-1}); x_k^m + \beta \cdot \widehat{E}(V_{N-1-k}^m) \right];$$

$$(V_1^m)^\epsilon = \left[ -(V_1^m)^\epsilon; +(V_1^m)^\epsilon \right] = \left[ (x_{N-1}^m + \beta \cdot V_0^m); (x_{N-1}^m + \beta \cdot V_0^m) \right] \tag{6}$$

## 5 Illustrative example of fuzzy-stochastic sequential real option model with fuzzy investment cost

The sequential fuzzy-stochastic real option value with fuzzy investment cost will be calculated. The binomial model, American option; replication value strategy, risk-neutral approach; expected present value objective function will be employed. The applied model is of three-phase type. We suppose that random cash flow (underlying asset) follows geometric Brown process. The model is base on the equation (4), (5) and (6).

Input data of the model are following: risk-free rate  $r = 10\%$ ; up-movement index  $U = 1,2$ . The price of underlying cash flow for last phase is 10 c.u., for the second phase 4 c.u. and the first phase 1 c.u. Risk-neutral probability of up movement is  $\widehat{p} = 72,73\%$  and down movement is  $\widehat{q} = 1 - \widehat{p} = 27,27\%$ . Fuzzy investment cost from the first to the second phase is  $\widetilde{s}^{12} = (s^L, s^U, s^\alpha, s^\beta) = (5, 5, 1, 1)$ , from the second phase to the third phase is  $\widetilde{s}^{23} = (s^L, s^U, s^\alpha, s^\beta) = (6, 6, 2, 2)$ .

The computes results are in Tab. 1. We can see sensitive value of sequential option and optimal starting stage depending on fuzzy epsilon cut.

epsilon	Value		Starting phase	
	min	max	min	max
<b>1</b>	4,073	4,073	V2	V3
<b>0,75</b>	3,515	4,678	V2	V3
<b>0,5</b>	2,995	5,393	V2	V3
<b>0,25</b>	2,52	6,116	V2	V3
<b>0</b>	2,044	6,844	V2	V3

Tab. 1 Fuzzy value of sequential real option in epsilon cut

## 6 Conclusions

The fuzzy-stochastic sequential option was proposed and investigated in the paper. The fuzzy-stochastic sequential real option model was formulated. Special partial fuzzy-stochastic model for fuzzy investment cost was introduced and illustrative example was presented. The model should be considered to be a generalised sensitivity sequential real option valuation.

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## References

- [1] Brandao, L. E., Dyer, J. S.: Decision Analysis and Real Options: A Discrete Time Approach to Real Option Valuation. *Annals of Operations Research* **135** (2005), p. 21.
- [2] Carlsson, C., Fuller, R.: A fuzzy approach to real option valuation. *Fuzzy Sets and Systems* **139** (2003), pp. 297-312.
- [3] Cheng Few-Lee, Tzeng Gwo-Hsiung, Wang Shin-Yun.: A Fuzzy Set Approach for Generalized CRR Model: An Empirical Analysis of S&P 500 Index Options. *Review of Quantitative Finance and Accounting*, **25** (2005) , pp. 255–275.
- [4] Chrysafis, K. A., Papadopoulos, B. K. : On theoretical pricing of options with fuzzy estimators. *Journal of Computational and Applied Mathematics*. **223/ 2**(2009) , pp. 552-566
- [5] Čulík, M.: Valuing of real options portfolio and its influence on project value. In: *22<sup>nd</sup> International Conference on Mathematical Methods in Economics*. 2004, pp. 56-62.
- [6] Čulík, M.: Real option application for modular project valuation. In: *24th International Conference on Mathematical Methods in Economics*. 2006, pp. 123-130.
- [7] Čulík, M.: Emissions trading: investment decision-making and real option analysis (simulation approach). *4th International Scientific Conference on Managing and Modelling of Financial Risk*, Ostrava. 2008, pp 11-18
- [8] Čulík, M.: Flexibility and project value: interactions and multiple real options. In. *3rd Global Conference on Power Control and Optimization*, Gold Coast, AUSTRALIA. POWER CONTROL AND OPTIMIZATION Book Series: AIP Conference Proceedings . 2010 Volume: 1239, pp 326-334
- [9] Dixit, A. K., Pindyck, R.S.: *Investment under Uncertainty*. Princeton University Press, 1994.
- [10] Dluhošová, D.: An analysis of financial performance using the EVA method. *Finance a úvěr - Czech Journal of Economics and Finance* **11-12** (2004).
- [11] Figa-Talamanca, G. M., Guerra, M. L., Stefanini, L.: Market Application of the Fuzzy-Stochastic Approach in the Heston Option Pricing Model. *Finance a Úvěr - Czech Journal of Economics and Finance* **62**, Issue 2, (2012), pp. 162-179
- [12] Guerra, M. L., Sorini, L., Stefanini, L.: Parametrized fuzzy numbers for option pricing. *IEEE International Conference on Fuzzy Systems*, London, 2007, VOLS 1-4, pp 727-732.
- [13] Guthrie, G.: *Real Options in Theory and Practice*. Oxford University Press, 2009.
- [14] Liyan Han, Wenli Chen: The Generalization of  $\lambda$ -Fuzzy Measures with Application to the Fuzzy Option. In: Wang, L. et al. (Eds.) *Proceedings: Fuzzy Systems and Knowledge Discovery*, 2006, LNAI 4223, pp. 762–765, Springer-Verlag Berlin Heidelberg.
- [15] Muzzioli, S., Reynaerts, H.: The solution of fuzzy linear systems by non-linear programming: a financial application. *European Journal of Operational Research* **177** (2007), pp 1218–1231
- [16] Muzzioli, S., Torricelli, C.: A multi-period binomial model for pricing options in a vague world. *Journal of Economic Dynamics and Control* **28** (2004), pp. 861-887.
- [17] Smith, J. E., Nau, R. F.: Valuing risky projects: Option pricing theory and decision analysis. *Management Science* **14** (1995), p. 795.
- [18] Thiagarajaha, K., Appadoob, S.S., Thavaneswaranc, A.: Option valuation model with adaptive fuzzy numbers, *Computers and Mathematics with Applications* **53** (2007), pp. 831–841.
- [19] Thavaneswaran, A., Appadoo, S.S., Frank, J.: Binary option pricing using fuzzy numbers. *Applied Mathematics Letters, In Press, Corrected Proof, Available online 13 April (2012)*
- [20] Trigeorgis, L.: *Real Options - Managerial Flexibility and Strategy in Resource Allocation*. Harvard University, 1998.
- [21] Wu, H.-C.: Using fuzzy sets theory and Black–Scholes formula to generate pricing boundaries of European options. *Applied Mathematics and Computation*, **185/ 1** (2007) , pp. 136-146.
- [22] Yoshida, Y.: A discrete-time model of American put option in an uncertain environment. *European Journal of Operational Research* **151** (2002), pp 153-166.
- [23] Yoshida, Y.: The valuation of European options in uncertain environment. *European Journal of Operational Research* **145** (2003), pp. 221-229
- [24] Zhang Jinliang, Du Huibin, Tang Wansheng: *Pricing R&D option with combining randomness and fuzziness. Computational intelligence*, PT 2, Proceedings Book Series: Lecture notes in artificial intelligence, 2006, Volume: 4114, pp 798-808
- [25] Zmeškal, Z.: Fuzzy-stochastic estimation of a firm value as a call option. *Finance a úvěr - Czech Journal of Economics and Finance* **3** (1999), pp. 168-175 .
- [26] Zmeškal, Z.: Application of the fuzzy - stochastic Methodology to Appraising the Firm Value as a European Call Option. *European Journal of Operational Research* **135/2** (2001), pp. 303-310.
- [27] Zmeškal, Z.: Hedging strategies and financial risks. *Finance a Úvěr - Czech Journal of Economics and Finance* **54** (2004), pp. 50-63.

- [28] Zmeškal, Z.: Approach to Real Option Model Application on Soft Binomial Basis Fuzzy - stochastic approach. In: *23rd International Conference on Mathematical Methods in Economics*. 2005, pp. 433-439.
- [29] Zmeškal, Z.: Real option applications based on the generalised multinomial flexible switch options methodology. In: *24th International Conference on Mathematical Methods in Economics*. 2006, pp. 545-553.
- [30] Zmeškal, Z.: Application of the American Real Flexible Switch Options Methodology A Generalized Approach. *Finance a Úvěr - Czech Journal of Economics and Finance* **58** (2008), pp. 261-275.
- [31] Zmeškal, Z.: Generalised soft binomial American real option pricing model (fuzzy–stochastic approach). *European Journal of Operational Research*. **207/ 2** (2010) , pp 1096-1103. doi:10.1016/j.ejor.2010.05.045.
- [32] Zmeškal, Z.: Real compound sequential and learning options modelling. In: *28th International Conference on Mathematical Methods in Economics*. 2010, pp. 688-693.
- [33] Zmeškal, Z.: Investigation of the Real Switch Option Value Sensitivity. In: *29th International Conference on Mathematical Methods in Economics*. 2011, pp. 774-779.