

An Empirical Model for the Raw Wood Assortment Price Predicting – Case Study in Slovakia

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Sales of timber, which represent the main source of forest management income, are essential for the economic welfare of forest businesses. Planning the timber sale management faces a certain amount of uncertainty and risk in such difficult conditions of climate change. Model scenarios make preparation for potential future development possible. The aim of the study was to create a prediction model of coniferous and non-coniferous sawlogs for the area of the Central Europe. The objective of the model was to estimate the variations in the price of coniferous or non-coniferous sawlogs following a linear regression equation in the analysed time series from 2001 to 2017. The price of coniferous sawlogs was significantly affected in a negative way by the amount of incidental fellings and in a positive way by the Gross Domestic Product. The price of the non-coniferous sawlogs was significantly affected in a positive way by the GDP and the volume of non-coniferous sawlog export. These factors caused a non-elastic response of the coniferous sawlog price. The impact of these factors depends to a great extent on the wood species composition of the forests in the Slovak Republic. The model also can be set for conditions of other countries when considering their economic indicators.

Keywords: Raw wood assortments; Timber prices; Prediction; Timber market; Incidental felling

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INTRODUCTION

Forest ecosystems worldwide are exposed to the adverse impacts of global climate change. Weather extremes (long-term droughts, spring frosts, gales, *etc.*) along with the outbreak of biotic pests (bark beetles, defoliators) have significantly decreased the stability of forest ecosystems in the last decade (Biber *et al.* 2015; Seidl *et al.* 2017; De Grandpre *et al.* 2018; Garcia-Valdes *et al.* 2018). In the case of forest management, these factors can be taken into consideration only with huge difficulties. The mentioned factors pose a great challenge for forest managers. Forest management is often focused on maximising the production and providing forest ecosystem services over longer time periods (periods longer than 100 years). The time stability and capability of responding is crucial in this situation (Yousefpour *et al.* 2015; Albrich *et al.* 2018). Only few forest ecosystems are influenced by the climate change to a small extent or do not need an immediate change of management (Jandl *et al.* 2019). Timber sale, presenting the main source of forest management incomes, is essential for the economic welfare of forest businesses (Gejdoš *et al.* 2019; Santos *et al.* 2019). Thus, planning the timber sale management faces a certain

amount of uncertainty and risk in such difficult conditions of global climate change (Holécý and Hanewinkel 2006; Hanewinkel *et al.* 2013; Trubins *et al.* 2019). Model scenarios make preparation for potential future development possible. They are always hypothetical and determine the future situations, and their occurrence is not certain but incidental (Mozgeris *et al.* 2019). For designing the models and scenarios for predicting the timber prices and timber market, researchers have to be familiar with its previous developments, mainly how the market behaved in similar crisis situations (Gejdoš and Potkány 2017; Gejdoš *et al.* 2019). Along with incidental natural factors, economic, and social criteria are important in these models as well (Malinen *et al.* 2015; Merganič *et al.* 2016). Several studies have dealt with creating prediction models for timber prices affected by incidental fellings and weather extremes (Hanewinkel *et al.* 2013; Kostadinov *et al.* 2014; Brunette *et al.* 2015; Gejdoš *et al.* 2019). Most of the models are based on stochastic statistical models. Hanewinkel *et al.* (2019) show that forecasted changes in temperature and precipitation may have severe economic consequences. On the basis of their model results, the expected value of European forest land will decrease owing to the decline of economically valuable species in the absence of effective countermeasures. They found that by 2100—depending on the interest rate and climate scenario applied—this loss varies between 14 and 50% (mean: 28% for an interest rate of 2%) of the present value of forest land in Europe, excluding Russia. Kostadinov *et al.* (2014) discuss the potential of applying agent-based modeling to wood markets. The model includes wood-producing agents, such as public foresters and private forest owners, roundwood-consuming agents, such as sawmills, different classes of wood fuel consumers, and in-between wood traders. Brunette *et al.* (2015) propose an actuarial insurance model to insure multiple natural hazards (windthrow, fire, insect outbreak) in forests that determine the insurance premium in different scenarios. They propose two different links for the hazards mutually dependent or independent. In addition, they propose two parametric solutions, a discrete time period approach or a continuous one. The most efficient solution is obtained when assuming mutually independent natural hazards and a continuous time period approach. Such a solution provides gross insurance premiums ranging from €5.62/ha. Gejdoš *et al.* (2019) used the stochastic model ARIMA with an autocorrelation coefficient for raw-wood assortment prices predicting the future development. Prediction of the future timber price development made by this model was identified as the most probable one. In addition, information on the local business relationships and forest logging potential in individual countries is important, too.

However, only a few of them consider the long-term previous price development of raw wood assortments in more countries in one region. The models include mainly the price development of a shorter time period in one country and production cost optimisation in various scenarios in forest ecosystem management. Another reason is also the difficulty of comparing the prices of raw wood assortments caused by different quality requirements in individual countries (Malinen and Kilpeläinen 2013).

The aim of the study was to create a prediction model of coniferous and non-coniferous sawlogs in the conditions of the Slovak Republic, based on longitudinal observations of price development and considering the extreme impacts of incidental factors in the past decades.

The results of the study should represent a model providing the predicted price of coniferous and non-coniferous sawlogs in the future, considering the size and the intensity of the incidental factors affecting the forest ecosystem. The objective of the model was to estimate the variations in the price of coniferous or non-coniferous sawlogs following a

linear regression equation in the analysed time series from 2001 to 2017. Model quantification enabled authors to solve the equation, *i.e.*, to calculate the values of the response variable (price of the coniferous sawlogs, price of the non-coniferous sawlogs) depending on the explanatory variables (factors affecting the price of the coniferous or non-coniferous sawlogs).

The aim was to design a model that would reflect the current tree species composition of the temperate zone forests and the impact of negative factors. Such a model that is based on a previous long-term price development in the conditions of global climate change has not been published so far in any scientific literature.

EXPERIMENTAL

Materials and Methods

Prices of raw wood assortments

Information on the nominal prices of coniferous and non-coniferous sawlogs was obtained and collected from the Forestry Market Information System issued quarterly by the National Forestry Centre in Zvolen (Slovakia) and is available online (2019). The sawlog product range was selected due to its high ratio in the assortment structure in the long term, regarding the coniferous (the highest ratio) and non-coniferous wood species (the second highest ratio). The prices were in €·m⁻³ without value-added tax (VAT) for the dispatching supplier yard and were evaluated for individual months for the years of 2001 to 2017. The prices before this year were recalculated using the average monthly exchange rate Slovak crown/€ by the National Bank of the Slovak Republic (2019). The average annual prices were calculated from these prices, as some variables (*e.g.*, growth domestic product, volume of incidental fellings) of the model under consideration were evaluated only at annual intervals. Euro as a currency has been used in Slovakia since 2009. The created database of prices development was a complex input database, which was unique and has not been published in any scientific studies so far. The data were not statistically modified, nor was the impact of inflation during the monitored period considered. Therefore, the prices mirrored better the influence of the specific period and factors that occurred during the period and affected the timber prices.

Empirical model creation

The objective of the model was to estimate the variations in the price of coniferous or non-coniferous sawlogs following a linear regression equation in the analysed time series from 2001 to 2017.

Following a theoretical formulation of relations and selection of the response and potential explanatory variables, the general linear equation of the model of coniferous (non-coniferous) sawlog price is as follows in Eq. 1,

$$Q_t = a + b_1 \cdot f_{1(t)} + b_2 \cdot f_{2(t)} + \dots + b_k \cdot f_{k(t)} + u_t \quad (t = 1, 2, \dots, n) \quad (1)$$

where Q_t is price (€·m⁻³) of coniferous (non-coniferous) sawlogs in the monitored year t , $f_{1-k(t)}$ are factors affecting the price of coniferous (non-coniferous) sawlogs in the year t , a is absolute member of the model, b is estimated parameters of the independent variables, u_t is incidental element of the model in the year t , k is the number of factors affecting the price of coniferous (non-coniferous) sawlogs, and n is the number of observations.

When creating the model, the impact of the delayed variables from the previous period was considered. To estimate the model parameters, the method of least squares and its characteristics was used (Turner and Buongiorno 2004). The statistical significance and information value of individual model parameters as well as the whole model was determined by testing the econometric models. At the same time, fulfilling the assumptions about the characteristics of the incidental element of the model and about independence of explanatory variables was tested. Within the economic interpretation of the model, the factors affecting the price of the coniferous (non-coniferous) sawlogs will be evaluated, average relative factor elasticities will be calculated, actual and estimated prices of coniferous (non-coniferous) sawlogs will be compared, and the impact of individual factors will be assessed. The final market timber price is influenced by the determinants of supply and demand for timber assortments. Timber supply is determined by the production capabilities of the forest enterprises and by the allowable cut, and it is also influenced by the amount of incidental felling. Demand for raw-wood assortments is derived from the demand for wood products and affected by the inland and overseas consumption of wood products. Potential factors affecting the price of coniferous and non-coniferous sawlogs are provided in Tables 1 and 2.

Statistical analyses were carried out using the Statistica software (Statsoft Inc., version 12, Praha, Czech Republic).

Table 1. Potential Factors Affecting the Price of Coniferous Sawlogs in the Slovakia

Factor	Factor Abbrev.	Unit	Max.	Min.	Avg.	Hypothesis Influence on Sawlog Prices
Planned Coniferous Felling Quantity	Ei	Thousand m ³	4255	2517	3521	-
Volume of Coniferous Incidental Felling	Ki	Thousand m ³	6151	1580	3796	-
GDP (Current Prices)	GDP	Billion €	85	34	63	+
Production of Coniferous Sawnwood	PRi	Thousand m ³	2063	845	1386	+
Coniferous Sawnwood Consumption	SRi	Thousand m ³	1803	134	877	+
Export of Coniferous Sawnwood	Eri	Thousand m ³	1092	283	659	+
Export Price for Coniferous Sawnwood	CERi	Thousand USD·m ⁻³	490	90	232	+
Import of Conif. Sawnwood	Iri	Thousand m ³	358	23	150	-
Import Price for Coniferous Sawnwood	CIRi	Thousand USD·m ⁻³	568	165	326	+
Price Index for Wood Products (Instant Prices 2005)	ICVD		104	96	100	+
Value of Construction Production in Current Prices	HSP	Million €	6473	2609	4569	+

Data on the planned and incidental fellings were obtained from the Green Reports of the Forest Management (Report on the forest sector of the Slovak Republic, Ministry of

Agriculture and Rural Development of the Slovak Republic. 2019). The data on the wood products and their prices were collected using the database Food and Agriculture Organization of the United Nations - FAOSTAT (FAOSTAT 2018). Further data (GDP, price indexes) were processed using the Slovak statistical yearbooks of the Statistical Office of the Slovak Republic (2002 to 2018). Data on the value of production in constructions were processed using the Yearbooks of Construction Industry of the Ministry of Transport and Construction of the Slovak Republic (2019). All the data were summarised and evaluated *via* standard methods of database creation. Individual factors were selected to truly reflect their impact on the price of the coniferous and non-coniferous sawlogs.

Table 2. Potential Factors Affecting the Price of Coniferous Sawlogs in the Slovakia

Factor	Factor Abbrev.	Unit	Max.	Min.	Avg.	Hypothesis Influence on Sawlog Prices
Planned Non-coniferous Felling Quantity	EI	Thousand m ³	5493	3101	4297	-
Volume of Non-coniferous Incidental Felling	KI	Thousand m ³	1847	301	687	-
Volume of Coniferous Incidental Felling	Ki	Thousand m ³	6151	1580	3796	-
GDP (Current Prices)	GDP	Billion €	85	34	63	+
Production of Non-coniferous Sawnwood	PRI	Thousand m ³	782	157	470	+
Non-coniferous Sawnwood Consumption	SRI	Thousand m ³	909	380	578	+
Export of Non-coniferous Sawnwood	ERI	Thousand m ³	282	50	137	+
Export Price for Non-coniferous Sawnwood	CERI	Thousand USD.m ⁻³	1749	169	637	+
Import of Non-coniferous Sawnwood	Irl	Thousand m ³	74	12	29	-
Import Price for Non-coniferous Sawnwood	CIRI	Thousand USD.m ⁻³	1316	305	663	+
Price Index for Wood Products (Instant Prices 2005)	ICVD		104	96	100	+
Value of Construction Production in Current Prices	HSP	Million €	6473	2609	4569	+

RESULTS AND DISCUSSION

Model for Coniferous Sawlog Prices

Following the econometric analysis of the period of 2001 to 2017, the equation (Eq. 2) for calculating the coniferous sawlog price was designed as follows,

$$C_t^{ihg} = 24.75 - 0.004K_t + 0.76 GDP_t \quad (2)$$

where the dependent variable C_t^{ihg} is the price ($\text{€}\cdot\text{m}^{-3}$) of the coniferous sawlogs in the year t , the independent variable GDP_t is the gross domestic product in prevailing prices (billion- €), and KI_t is volume of the coniferous incidental felling in the year t (thousand m^3).

The price of the coniferous sawlogs in the analysed time series varied in the interval of $40.05 \text{ €}\cdot\text{m}^{-3}$ (2005) to $69.88 \text{ €}\cdot\text{m}^{-3}$ (2013). The price of the coniferous sawlogs was significantly affected in a negative way by the amount of incidental fellings and in a positive way by the GDP. The increasing amount of processed incidental felling increased the offered amount of coniferous sawlogs, leading to a decrease in its prices. In contrast, an increase in GDP encouraged an increased demand for wood products, causing an increase in the prices of wood assortments. Figure 1 illustrates a comparison of the real prices of coniferous sawlogs with prices calculated using the regression equation in the time series from 2001 to 2017.

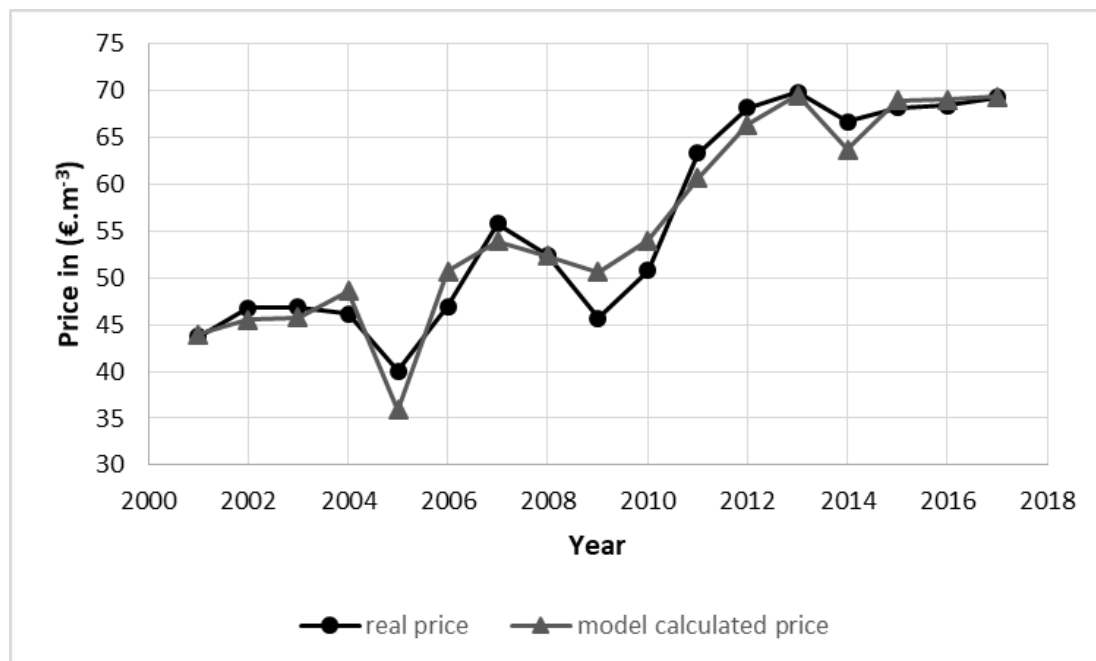


Fig. 1. Real and model calculated price for coniferous sawlogs during 2001 to 2017 ($\text{€}\cdot\text{m}^{-3}$)

Both factors (amount of incidental fellings, GDP) caused a non-elastic response of the coniferous sawlog price. If the amount of incidental fellings increases 1%, the price of the coniferous sawlogs will decrease 0.3%. If the GDP increases 1%, the price of the coniferous sawlogs will increase 0.85%. Significantly lower elasticity in the case of incidental fellings can indicate restricting the planned logging at the occurrence of incidental fellings. The factor of coniferous incidental fellings explained 33% of the variance in the dependent variable – price of the coniferous sawlogs, factor of GDP explained 67% (Beta coefficients).

Table 3 (part A) presents the statistical characteristics of the calculated model.

The econometric model and its regression parameters were statistically significant at the level $\alpha = 0.05$. Multicollinearity tested by the Farrar-Glauber test (Akinniyi and Sanni 2017) $\chi^2 = 3.79$ (12.59) was not confirmed in the model. Autocorrelation of residuals in the model was tested by the Durbin-Watson test (White 1992) and Von Neumann ratio (Von

Neumann 1941). The Durbin-Watson test did not prove the occurrence of autocorrelation of residuals (DW = 1.55). Von Neumann ratio proved the absence of autocorrelation of residuals in the model (D = 1.65, critical value 1.33 to 2.92).

Table 3. Statistical Characteristics of Model – Price of Coniferous and Non-coniferous Sawlogs

Coniferous Sawlogs – Part A					
N = 17	R = 0.97369331, R2 = 0.94807867, F(2, 14) = 127.82, p < 0.00000				
	Coeff. β	b	Standard Error From b	T(1)4	p-value
Absolute Term		24.75473	2.798068	8.84708	0.000000
Volume of Coniferous Incidental Fellings	0.33	-0.00445	0.000574	-7.74794	0.000002
GDP (Current Prices)	0.67	0.76390	0.047778	15.98871	0.000000
Non-coniferous Sawlogs – Part B					
N = 17	R = 0.86906331, R2 = 0.75527103, F(2, 14) = 21.603, p < 0.00005				
	Coeff. β	b	Standard Error From b	T(1)4	p-value
Absolute Term		27.75224	3.894807	7.125447	0.000005
GDP (Current Prices)	0.77	0.30453	0.046395	6.563804	0.000013
Export of Non-coniferous Sawnwood	0.23	0.02915	0.011043	2.640075	0.019401

Model for Non-coniferous Sawlog Prices

Following the econometric analysis of the period of 2001 to 2017, the equation for non-coniferous sawlog price was designed as follows (Eq. 3),

$$C_t^{lg} = 27.75 + 0.305 GDP_t + 0.029 ERI_t \quad (3)$$

where the dependent variable C_t^{lg} is price (€·m⁻³) of the non-coniferous sawlogs in the year t , the independent variable GDP_t is gross domestic product in prevailing price (billion €), and ERI_t is the export of the non-coniferous sawnwood in the year t (thousand m³).

In the analysed time series, the price of the non-coniferous sawlogs varied in the interval of 41.91 €·m⁻³ (2005) to 58.90 €·m⁻³ (2017). The price of the non-coniferous sawlogs was significantly affected in a positive way by the GDP and the volume of non-coniferous sawlog export. In contrast to the coniferous sawlog model, the price of the non-coniferous sawlogs was not affected by the supply. The price was determined by the demand. Increased GDP and export caused an increased demand for wood products affecting the increase in wood assortment prices. The impact of factors was proved by the fact that the demand for wood was derived from the demand for wood products. Figure 2 illustrates the real prices of non-coniferous sawlogs and prices calculated using the regression equation in the time series from 2001 to 2017.

Both factors (GDP, amount of export of non-coniferous sawnwood) caused a non-elastic response of the non-coniferous sawlog price. An increase of 1% in GDP will cause an increase of 0.08% in the price of non-coniferous sawlogs. The factor of GDP explained as much as 77% of the dependent variable variance – price of the non-coniferous sawlogs;

for the factor of export of non-coniferous sawnwood it was 23% (Beta coefficients). Statistical characteristics of the calculated model are presented in Table 3 (part B).

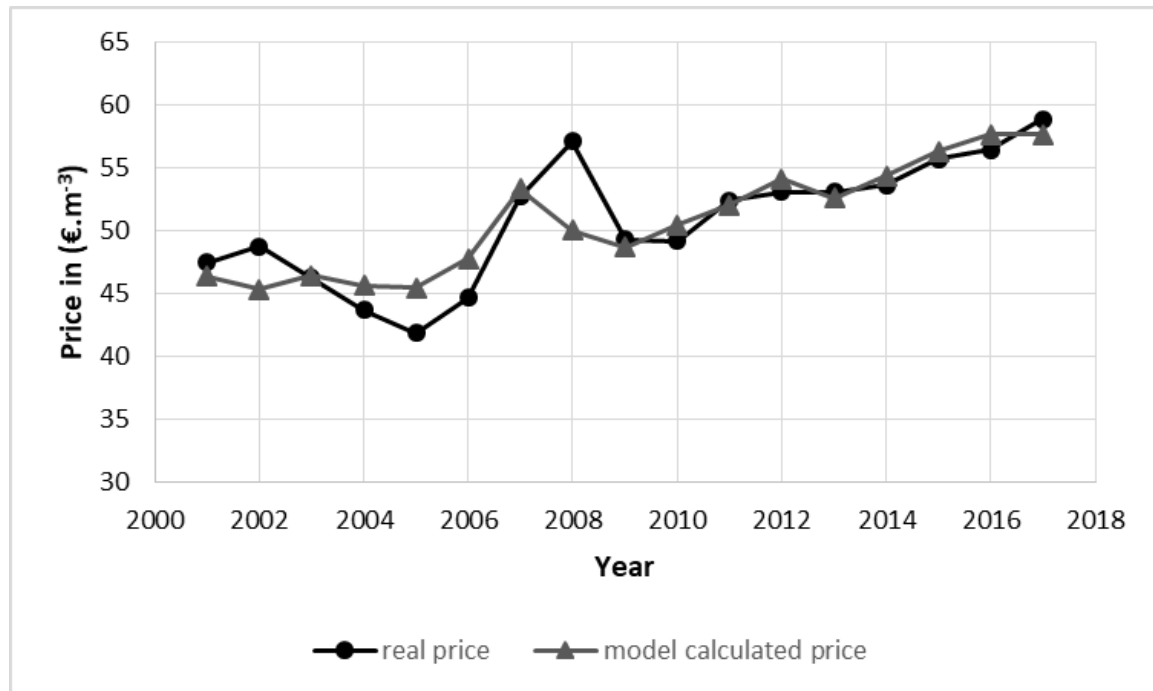


Fig. 2. Real and model calculated price for non-coniferous sawlogs in 2001 to 2017 (€/m³)

The econometric model and its regression parameters were statistically significant at the level of $\alpha = 0.05$.

Multicollinearity ($\chi^2 = 3.2$ (12.59)) and autocorrelation of residuals (DW = 1.55, D = 1.65, krit. 1.33 to 2.92) were not confirmed statistically in the model. Figures 1 and 2 along with the statistical analysis point at a relatively accurate setting of the model, which can thus serve as a good tool for predicting the timber prices in the current unstable market conditions. Therefore, it can present a fairly good tool for forest enterprise management in the long-term planning. The model can be set also for conditions of other countries when considering their economic indicators. The model presented a good theoretical background for designing similar models in the conditions of the Central Europe.

Discussion

The results of this study proved a significant impact on the prediction model of the prices of raw wood assortments considering the factors as GDP, export of the non-coniferous sawnwood, and amount of incidental coniferous felling. The impact of these factors depended to a great extent on the wood species composition of the forests in the Slovak Republic. Härtl and Knoke (2014) studied the impact of crude oil prices on timber prices. A significant decrease in oil prices caused a subsequent decrease in the prices of beech sawlogs only. Therefore, it cannot be considered as a significant factor for model design. The authors of this study predicted, considering various scenarios of oil price development, a more radical price increase until 2020 only for following categories: assortments of spruce pulpwood and fuelwood; class III. C of beech sawlogs; and pulp-

and fuelwood. This prediction was proved also by the authors' results analysing the decrease in oil prices at the turn of 2014/2015.

Gejdoš *et al.* (2019), when calculating the prediction of sawlog prices, proved that the impact of vast windthrows on the prices of these assortments decreases significantly one year after the windthrow occurred and the impact is approximately 14% on average. They had a significant impact on the timber market within one year after they occurred. The study also demonstrated a clear impact of specific factors (*e.g.*, unfavourable business contracts). However, when generalising the model for calculating the prices for a broader region, these impacts cannot be considered, because they are market-specific and are of incidental nature. This study, however, confirmed that the development of raw wood assortment prices in the Slovak Republic, Czech Republic, and Austria correlate and their development is with significant changes affected by almost identical factors. Similar situation is also in Germany. Following these results, the designed model can be partially generalized to a broader geographical area and to more countries in the Central Europe or to countries with similar tree species composition influenced by biotic and abiotic harmful factors of similar intensity.

Leskinen and Kangas (1998) designed a model for predicting the price development following the stochastic statistical model. This model was then used for creating a decision making concept for strategic management in timber trade, while using two further key factors – standing timber volume and net current value of revenues and costs for a decade (Kangas *et al.* 2000). However, these statistical models are based on long-term comparisons of price development or on questionnaire surveys. They do not thoroughly consider the impact of statistically tested and significant impact factors in the given period.

Gejdoš and Potkány (2017) predicted the price development in the Slovak Republic using the method of moving averages. The statistical analysis showed that 26% of the price variability is affected by the seasonal impacts and 73% is influenced by the price trends on the market, which corresponded approximately with the present model for predicting the prices of coniferous sawlogs.

Kostadinov *et al.* (2014) modelled the impact of forest area growth on the timber market in Switzerland considering the specific conditions of the country. The highest decline in timber prices was recorded in the case of 3.9% growth of the forest area per year. In contrast, the highest increase in timber prices was predicted for the scenario with 1.3% growth of the forest area per year. However, the model was supplemented by the social criteria and preferences of individual sector consumers. Therefore, it cannot be applied generally to other markets.

Aguilar *et al.* (2014) assessed the impact of the logging methods in the USA in the prices of fuelwood and wood biomass. The statistical model was based on a questionnaire survey, which revealed that 38% of forest owners preferred integrated logging and harvesting technologies and 52% did not want to log at all. Only 8% of owners preferred traditional logging methods. Such findings can affect the timber prices significantly in the future, as well, because in society there is a shift towards using non-production forest functions. The present model has not considered this variant, yet. The forest utilisation covers mainly the production functions, which are significantly affected by the amount of incidental fellings.

CONCLUSIONS

1. The economic efficiency of forest enterprises in Slovakia is decreasing due to the increasing amount of incidental fellings, which is connected to a decrease in the wood quality and a missing qualified labour force. Traditional econometric statistical models predicting the prices are satisfactory in standard conditions.
2. The present study introduced a model considering relevant factors that have influenced the wood prices on regional markets for the past two decades. After modifying the model in terms of individual markets, it can be used also in other countries, at least in the Central European region, since the price development of raw wood assortment in the countries of this region show correlation and significant changes are affected by identical factors of macroeconomic development and impact of harmful factors. The present model confirmed a good prediction capability and can be thus a good tool for strategic management planning in forestry enterprises.
3. In the Slovak conditions, managements of many forestry enterprises significantly underestimated this strategic field and did not give it sufficient attention. In the end, it was reflected in their poor financial health, obsolete machinery, and lack of qualified staff. It also resulted in a poor public image of forestry and it will take long time and effort to improve this condition.
4. In present model the price of the coniferous sawlogs was significantly affected in a negative way by the amount of incidental fellings and in a positive way by the GDP. The price of the non-coniferous sawlogs was significantly affected in a positive way by the GDP and the volume of non-coniferous sawlog export.
5. The created prediction model reflected factors that were shown to have a statistically significant impact on the timber price development in the Slovak Republic in the past two decades. In the future, mainly in the next decade, it will be necessary to investigate the impact of such factors on the timber price development. After statistical verification, the designed model can be modified repeatedly for the current conditions. It created a good foundation for a future timber price prediction model that can be modified according to the requirements.

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