Company’s intellectual capital impact on market value of Baltic countries listed enterprises

JEL Classification: A10; G32; O34; J24

Keywords: intellectual capital; human capital; structural capital; juridical capital; relational capital; market value

Abstract

Research background: Currently the topic of a company’s intellectual capital is being widely investigated by various researchers. Nevertheless, only a small number of studies on the company’s intellectual capital impact on its market value were conducted. What is more, the concept of a company’s intellectual capital itself is not unified. There are some discrepancies in defining a company’s intellectual capital, unifying structural model of the company’s intellectual capital, and harmonizing the research methods and models of how to evaluate a company’s intellectual capital.

Purpose of the article: The aim of the article is to examine various scientific approaches of the company’s intellectual capital and its impact on the market value of a respective company; to prepare a model of company’s intellectual capital and its impact on the market value. What is more, the aim of this article is to check and test the model effectiveness using an example of the Baltic States listed companies.

Methods: Data on 58 Baltic States’ companies that are listed in Nasdaq Baltic stock exchange were taken as the basis of the research. Based on four component model (human capital, structural capital, juridical capital, relational capital) a set of indicators for assessing company’s intellectual
capital was formed. Expert evaluation was used in order to assign weights for different structural parts of intellectual capital. An exploratory factor analysis was conducted in order to find out what factors are the most significant for a company’s intellectual capital. In order to find out how specific elements affect company’s intellectual capital, a pair-wise multiple correlation and regression analysis were used. An average comparison method was used to reveal differences between companies of different countries.

**Findings & Value added:** The study contributes to the Baltic States’ knowledge on intellectual capital. It was detected that it is appropriate to use human capital, structural capital, juridical capital, and relational capital structural parts as components of company’s intellectual capital while investigating its impact on market value of a respective company. According to the obtained results, the model of a company’s intellectual capital and its impact on the market value was created, optimized, and its validity checked using exploratory factor analysis. The model was used to test the Baltic States listed companies and how their intellectual capital affects the market value. It was identified that intellectual capital in the listed companies of the Baltic States has a positive impact on their market value. Nevertheless, the study revealed that intellectual capital structural parts do not equally affect the market value of listed companies. The findings support the conclusion that human capital and relational capital have the greatest influence on the market value of listed companies. Companies where structural capital comprises the largest proportion of intellectual capital had lower levels of intellectual capital aggregated index, which could be examined in future studies.

**Introduction**

Nowadays companies face a huge variety of challenges affecting their market value. Previously scientists and researchers constantly stressed the importance of tangible assets. This approach has slightly changed leading to the intellectual capital of a company being the most significant factor. Some studies show a huge importance for innovations, new ideas, which are generated by human capital which is considered to be a structural part of an intellectual capital. Modern economy is characterized by increasing importance of knowledge related to the quality of human capital and knowledge embedded in the products (Balcerzak, 2016, pp. 11–27). Intellectual capital is investigated by various specialists from different areas: heads of companies, scientists, researchers, international institutions, politicians, accountants, economists, and etc. Nevertheless, it is difficult to evaluate the intellectual capital of a company. Only several elements of the intellectual capital are provided in the financial statements of various companies, which is not sufficient to determine the aggregate value of the intellectual capital of a company. What is more, the concept of the intellectual capital of a company is still under the investigation itself and researchers do not have one common position. There is no common universally used definition of the intellectual capital of a company, no common structure of the intellectual capital, and there are numerous methods to assess the intellectual capital of a company. Nevertheless, the importance of intellectual capital is indisputable. In the modern world, intellectual capital has become one
of the most valuable assets of an organization, region or state (Markhaichuk & Zhuckovskaya, 2019, p. 90). This article is designed in order to align the discrepancies faced in the scientific literature and to solve the research problem described below.

The research problem of this article is how to assess the intellectual capital of a respective company and what effect it has on the market value. The purpose of the article is as follows: to examine various scientific approaches of the intellectual capital of a respective company and to assess its impact on the market value; to prepare a model of company’s intellectual capital and its impact on the market value. What is more, the aim of this article is to check and test the effectiveness of the abovementioned model using an example of the Baltic States listed companies. The object of the research is the impact of a respective company’s intellectual capital on its market value.

The composition of the article is organised as follows. Firstly, the concept of a company’s intellectual capital and its market value is presented in the theoretical part. The main features of the company’s intellectual capital are discussed, the development stages of the intellectual capital concept are also presented and discussed. The analysis showed that although research papers regarding intellectual capital are constantly conducted, no common intellectual capital concept is being provided yet. Different researchers provide multiple intellectual capital definitions, features, structural parts. In this article a unified company’s intellectual capital definition is proposed. Secondly, the next part of the article explains the methodology and data collection. In order to identify intellectual capital’s impact on a company’s market value an inductive approach was selected and is described in the research part. The formation of the model of intellectual capital evaluation is presented and discussed. Finally, the last two parts present and discuss empirical results, provides discussion points, main conclusions, and suggest opportunities for potential future studies.

The theoretical aspects of company’s intellectual capital and its market value

To begin with, the theory of the intellectual capital of a company starts in 1969, when American–Canadian economist John Kenneth Galbraith mentioned the notion of intellectual capital itself. Although the topic has been investigated by a lot of scientists and researchers, there is still no common and widely used definition of it. Also, no mutual agreement is reached regarding the structure of intellectual capital. In order to understand the con-
cept better and indicate the main features of it, the scientific literature review was conducted. During the investigation, it was identified that the development of the intellectual capital concept can be divided into four main stages (Figure 1).

The development stages shown in the picture above (Figure 1) represent the intellectual capital concept phases, which were divided into four main stages based on the scientific literature review. These stages could potentially be compared with Tuckman’s group/team formation theory stages as the development of both is quite similar. Firstly, the initial stage of the concept of intellectual capital should be considered as a forming period. It is understood as an opening, elemental period when only the notion of the intellectual capital is present. According to Cooper and Sherer (1984, pp. 998–1020), intellectual capital at that time was understood as an invisible concept, but with clearly visible benefits. During the forming period, only the rudiments of the intellectual capital concept were noticed and a low number of scientific papers were released with the keyword "intellectual capital". The second stage of the intellectual capital concept development should be considered as a storming phase when there was a boost of intellectual capital scientific research. The majority of scientists (Roos & Roos, 1997, pp. 413–426; Stewart, 1997, p. 265; Edvinsson & Malone, 1997, p. 217; Sullivan, 1998, p. 384; Bontis, 1998, pp. 63–76; Nahapiet & Ghoshal, 1998, pp. 242–266) investigated intellectual capital, how to define it, what its main features and structural parts are. Nevertheless, it was noticed that during this stage between scientists and researchers there were a lot of discrepancies regarding the definition of intellectual capital, its main features and functions. The opinions of different researchers of intellectual capital were not harmonised and aligned together.

The third stage of the intellectual capital concept development could be considered as a norming phase, when the majority of scientists and researchers (Shatrevich et al., 2015, pp. 76–94; Yli-Renko et al., 2001, pp. 279–304; Serenko & Bontis, 2004, pp. 185–198; Shapiro, 2006, pp. 324–335; Cabrita & Bontis, 2008, pp. 212–237; F-Jardón & Martos, 2009, pp. 600–616; Yang & Lin, 2009, pp. 1965–1984) had a common goal — to understand how the intellectual capital should be measured and evaluated. Although the majority of researchers shared the same goal, they used different definitions of intellectual capital, accentuated various features of intellectual capital and investigated intellectual capital using distinct structural parts. During this period, many authors (Chesbrough, 2003, p. 227; Youndt et al., 2004, pp. 335–361; Subramaniam & Youndt, 2005, pp. 450–463; Gray, 2006, pp. 793–819; Menor et al., 2007, pp. 559–578; Wu et al., 2007, pp. 279–296; Hsu & Fang, 2009, pp. 664–677; Yang & Lin, 2009,
analysed intellectual capital and company performance by choosing different factors or indexes and investigating intellectual capital’s impact on respective variables in various companies. Nevertheless, no common theory was identified and intellectual capital definition, features, function, structural parts were still under discussion.

The fourth stage, which can be considered as a performing phase, is still ongoing. Scientists and researchers investigate intellectual capital from a broader perspective: not only stronger social, economic, environmental systems in various companies and organizations, but also in multiple countries, cities, and communities. A majority of studies (Carmona-Lavado et al., 2010, pp. 681–690; Namvar et al., 2010, pp. 676–697; Sharabati et al., 2010, pp. 105–131; Cabello-Medina et al., 2011, pp. 807–828; Delgado-Verde et al., 2011, pp. 722–737; Huizingh, 2011, pp. 2–9; Leitner, 2011, pp. 1–18; Hsu & Sabherwal, 2012, pp. 664–677; Dumay, 2013, pp. 5–9; Edvinsson, 2013, pp. 163–172; Wang & Chen, 2013, pp. 861–879; Dameri & Ricciardi, 2015, p. 860–887; Inkinen, 2015, pp. 518–565) revealed that intellectual capital is the key factor of a successful company and it increases the company’s value, market value, sustainability, by raising the competitiveness of an individual company. Some researchers (Schaffers et al., 2011, pp. 431–446; Chourabi et al., 2012, pp. 2289–2297; Ricciardi & Za, 2014, pp. 163–171; Dameri & Ricciardi, 2015, pp. 860–887) concentrate not only on companies, they accentuate the importance of knowledge, innovations and provide the vision of a smart city, where all aspects mentioned before are considered as a priority. What is more, new topics of intellectual capital research are currently investigated, for instance, intellectual capital protection issues (Olander et al., 2015, pp. 742–762). The question each company faces is how to maintain an employee who has exceptional knowledge, skills, experience, is highly motivated, creative, innovative, knows working procedures very well, and is capable of solving issues independently and quickly.

Although studies regarding intellectual capital are constantly conducted, no common intellectual capital concept has been provided yet. Different researchers propose multiple intellectual capital definitions, features, structural parts. The table below presents various intellectual capital definitions provided by multiple researchers (Table 1).

Table 1 is designed according to the development stages of intellectual capital concept. It was noticed that intellectual capital definitions provided by multiple researchers are not equally understood and there is no harmonised and widely recognised definition of intellectual capital. Different sources agree that the initial stage of the intellectual capital concept itself is 1969, when famous the United States and Canada economist John Kenneth
Galbraith wrote a letter to his friend Michael Kalecki stating: “I wonder if you realize how much those of us in the world around have owed to the intellectual capital you have provided over these past decades.” The phrase was quickly taken into account and spread all over the world. Nevertheless, not all researchers explain the concept of intellectual capital in the same way. Some researchers accentuate the knowledge, experience, education, which belongs to a respective company. Others highlight the intangible and hidden value in a company, which creates a competitive advantage. There are opinions that intellectual capital is all intangible elements that belong to a respective company and increases its value. Also, intellectual capital is understood as a rare and unique resource, which is both dynamic and irreplaceable for the successful activity of a company. In this scientific paper a definition of a company’s intellectual capital was proposed based on the most used features and descriptions provided by various researchers from different stages of intellectual capital concept.

Company’s intellectual capital — the aggregate of intangible resources a company has at its disposal that enables a company to operate at its best, creates a competitive advantage and increases market value.

There are many ways to describe intellectual capital, but the abovementioned definition provides a broader understanding of what intellectual capital is in a company and what its major advantages are.

It is helpful to clarify the structure of the intellectual capital of a company in order to represent the definition better. Nevertheless, there is a vast number of structural parts of the intellectual capital of a company and the majority of them overlap. The most frequently used model of the intellectual capital structure is the combination of human capital, structural capital, and customer capital (Roos & Roos, 1997, pp. 413–426; Stewart, 1997, p. 265; Bontis, 1998, pp. 63–76; Zéghal & Maaloul, 2010, pp. 39–60). Based on the review of the scientific literature, human capital by now is the only structural part, which is considered by all researchers in their investigations. The only exception is human-centered assets, provided by a researcher Brooking (1996, p. 224), but the content of this structural part of intellectual capital clearly refers to human capital. Other structural parts of intellectual capital are widely used, but a lot of discrepancies, overlaps, synonyms are present. Structural capital is used by various researchers versus organisational capital, innovation capital, process capital, physical capital, infrastructure assets, internal structure, research and development, informational technologies, collective values, and etc. Juridical capital is used in different researches as intellectual property, market assets, intellectual property assets, market capital, innovations, technologies, and etc. What is more, relational capital in various researches is used as reputa-
tional capital, client capital, customer capital, social capital, external structure, communicational capital, trademark value, and etc. The review conducted on scientific literature revealed that some of the abovementioned intellectual capital structural parts are used in different scientific papers as synonyms, some overlap, while some of them signify totally different approaches. In this scientific paper, the intellectual capital of a company is considered as the sum of four structural parts: human capital, structural capital, juridical capital, and relational capital. The structure of the intellectual capital of a company is provided in the picture below (Figure 2).

Figure 2 represents the intellectual capital structure proposed to use in this scientific paper. The structure was adopted in accordance with Stewart (1997, pp. 265) by adding an extra structural part, which is significantly important for a company — juridical capital. Intellectual capital of a respective company is understood as a whole and the competitive advantage and value are created only when all structural parts are fluently working together. First of all, human capital can be understood as an employee knowledge, skills, wisdom, competence, motivation, experience, psychological health, and similar elements that help to perform daily tasks and achieve targets of a company. The elements of human capital can be grouped into three main sections: employees, their education, and investments in employees. Secondly, structural capital in this scientific paper is perceived as all elements in a company, which help employees to perform routine tasks in business, the supporting infrastructure that enables human capital — employees — to operate (i.e.: strategy, culture, procedures, financial resource allocation decisions, and etc.). It is useful to group structural capital elements into three parts as well: corporate identity, financial leverage, and Selling, General & Administrative costs (SG&A), which are not related to the direct production of a respective company. Corporate identity examples are as follows: a company’s strategy, vision and mission, management style, routines, culture, procedures, codes of conduct, and etc. Thirdly, juridical capital comprises the elements in a company that protect the laws and regulations and create a competitive advantage. All elements of juridical capital are grouped into two basic parts: intangible assets and legally protected information. Finally, relational capital is a customer relationship strength and loyalty of clients or institutions to which the company sells the product or service, the value of relationships, the value of a company, which is seen by stakeholders, and similar. The elements of relational capital can be classified into three main parts: the social characteristics of a company, relations, and relational expenses.

The importance of intellectual capital is indisputable, but it is extremely useful to clarify how a company’s intellectual capital is connected to its
market value. The management board is willing to increase the market value of their companies in order to foster the successful activity, continuity, and infuse additional funds and resources. The latter factors are the most important for joint-stock companies, which are willing to increase their companies’ market value, which can be easily calculated based on the market capitalization. There are some researchers (Abdolmohammadi, 2005, pp. 397–416; Chen et al., 2005, pp. 159–176; Tseng & Goo, 2005, pp. 187–201; Liu et al., 2009, pp. 260–276; Clarke et al., 2010, pp. 505–530; Ferrari & Veltri, 2011, pp. 66–84; Celenza & Rossi, 2014, pp. 22–34; Shakina & Molodchik, 2014, pp. 87–100) who investigate the company’s intellectual capital impact on its market value. Their analysis showed a strong statistically significant correlation between a company’s intellectual capital and its market value. To be more precise, the company’s market value in this scientific paper is considered as a multiplication of a number of company’s shares in circulation and market price of a single share. It was noticed that a company’s market value might be influenced by many factors, for instance: external economic, social, and political factors; market factors; employees of a respective company; intangible assets of a respective company; financial factors, and etc. One of the factors, namely, the company’s intellectual capital was selected to investigate further.

To sum up, company’s intellectual capital in this scientific paper is described as the aggregate of intangible resources a company has at its disposal that enables a company to operate at its best, creates a competitive advantage, and increases market value. Intellectual capital structure in this scientific paper is proposed as follows: human capital, structural capital, juridical capital, and relational capital. The main goal of this scientific paper is to identify the company’s intellectual capital impact on its market value. In the next paragraph, the methodological approach is presented.

Research methodology

In order to identify the impact of a company’s intellectual capital on its market value, an inductive approach was selected. At this step, the company’s intellectual capital indicators are selected and subsequently, the model of intellectual capital evaluation is formed. The next step is a formulation of hypothesis and the last step is to describe regression models (Figure 3).

In order to create an adequate system for the company’s intellectual capital evaluation model, only the most informative and important indicators are chosen. Although every company is very different, the goal was to create such a model, which is comparable and could have been repeated in
various geographic areas or for different types of businesses. What is more, data availability and comparability over time have been taken into consideration.

For the empirical test of a model of a company’s intellectual capital and its impact on the market value, Baltic listed companies (Estonia, Latvia, and Lithuania) have been selected. The data was collected from their financial statements, consolidated annual reports, independent auditor’s findings, websites and social networks if needed. All of the three countries’ companies prepare their financial documentation in accordance with International Financial Reporting Standards (IFRS) as adopted by the European Union. The data is audited, reliable, and public. Such data enables econometrically correct assessments. A five-year period from 2011 to 2015 was chosen. In total, a total population of Nasdaq Baltic stock exchange consisting of 58 companies was included in the research (Estonia — 13, Latvia — 24, Lithuania — 21).

In this scientific paper, a company’s intellectual capital is calculated as an aggregate of four structural parts — human capital, structural capital, juridical capital, and relational capital. Factor values were calculated using the regression method. Data standardization was automatically performed, due to this, variables with a large standard deviation are no longer dominant and do not distort the results. Also, the standardization allows for comparisons between different measurement scales of data with each other. Data standardization is done by subtracting the average of the time series and dividing by the variance, so a standardized data average is 0 and variance is 1. For the calculation of aggregate values of intellectual capital factors a simple additive weighting method SAW was chosen.

The hardest part is the correct identification of the indicators’ weights. Usually, different fields put an importance on different intellectual capital structural parts. For example, management focuses more on human capital, whereas economists stress the balance of all elements of intellectual capital. Therefore, it is rather difficult to appropriately determine their weights. Researchers (Kannan & Aulbur, 2004, pp. 389–414; Cabrita & Bontis, 2008, pp. 212–237; Kim & Kumar, 2009, pp. 277–293; Cricelli & Greco, 2013, pp. 1–7; Montemari & Nielsen, 2013, pp. 522–546; Morariu, 2014, pp. 392–410; Cricelli et al., 2014, pp. 880–901; Mačerinskienė & Aleknavičiūtė, 2017, pp. 573–592) often use an expert judgement for the setting the weights of company’s intellectual capital structural parts. Giving equal weights would not be scientifically correct since different structural parts of intellectual capital do not have the same significance. In this scientific paper, an expert evaluation was conducted in order to determine the weights of the company’s intellectual capital structural parts.
The expert evaluation was conducted on November–December 2016. In total, 17 experts from all three Baltic countries and Nasdaq Baltic stock exchange participated in the research. Five experts were from Lithuania: two managers from Lithuanian listed companies and three social science academics from Mykolas Romeris University, Vilnius University, and Vilnius Gediminas Technical University. Five experts were from Latvia: two managers from Latvian listed companies and three social science academics from Riga technical university. Four experts were from Estonia: two managers from Estonian listed companies and two social science academics from Tallinn technical university. Three experts were employees of Nasdaq Baltic stock exchange. All experts from the academic field have doctoral degrees of social science, all experts from listed companies and Nasdaq Baltic stock exchange have master degree. The expert evaluation results were also checked using competency coefficients formulas and the validity of the test was checked using Kendall’s W coefficient, which was 0.797. The results are provided in the diagram below (Table 2).

The results revealed that the highest weight was given to human capital and the lowest to juridical capital. Relational capital was on the second and structural capital on the third place according to the importance. Most scientists in their studies also get similar results, showing that human capital is very important.

The construct validity is checked using exploratory factor analysis. The exploratory factor analysis it is important to draw attention to the problem of multicollinearity. As a result, indicators correlation coefficients are checked and if the latter is higher than 0.8, it is assessed whether it is appropriate to remove any indicator. Verifying the indicators (variables) suitable for factor analysis is conducted using anti-image matrixes consisting of partial correlation coefficients with a minus sign. The diagonal matrix has the variable eligibility factors MSA (Measure of Sampling Adequacy) and KMO (Kaiser, Meyer and Olkin) measure is used for decision if variables should be removed from the construct. If KMO is less than 0.5, the respective factor is unacceptable.

The assumption in factor analysis is taken that variation of variables can be explained by the distinguishing factor because the calculations do not include a margin of error. It calculates the covariance matrix of the eigenvalues and own vectors. Factor number is selected according to the Scree chart and calculated eigenvalues. According to the Kaiser recommendation, the number of properly calculated number of factors is determined by the eigenvalues, which are greater than one. If the results show that the indicators selected represent one construct, it means that the indicators are properly selected and reflect one area of interest. If the results show that the
indicators represent several different constructs, the obtained factors are determined by the map. Ongoing factors rotation is conducted in order to highlight the template of factors. In this research, it was chosen as an oblique factor rotation method *Promax*.

Based on the factor analysis results, an aggregate model of the company’s intellectual capital was suggested (Figure 4).

The abovementioned model is used not only for evaluation of a company’s intellectual capital itself but also for the determination about the company’s intellectual capital and its impact on the market value. In order to check, if there is a statistically significant relationship between a company’s intellectual capital and its market value, the following steps were taken:

1) formulation of two hypotheses:

   \[ H_0: \text{correlation coefficient of zero } (r = 0). \]

   \[ H_1: \text{the correlation coefficient is different from zero } (r \neq 0). \]

2) the determination coefficient \( R^2 \) is assessed. This ratio shows what part of the dependent variable is explained by regressors. The determination coefficient varies in the range of \([0, 1]\) and should be greater than 0.2.

3) the statistical significance of the model is determined. This is conducted using ANOVA p-values. The indicator shows if there are regressors associated with the dependent variable. If the p-value is greater than 0.05, it means that no variables are statistically significant. If the p-value is less than 0.05, it means that there are statistically significant variables and the model is appropriate to use for further review.

4) checking if all independent variables are statistically significant. Student t-tests are used for that and if the test p-value is less than 0.05, it means that the variable is statistically significant and it can be included in the model. If the p-value is greater than 0.05, the variable is not statistically significant.

5) checking multicollinearity using the dispersion decreasing multiplier VIF, which indicates whether the regressors are correlated with each other. VIF is calculated for each regressor and it is acceptable that VIF should be less than four.

6) the data contain outliers are verified. Cook measure is calculated for each set of regressors and it should not exceed 1. If it is higher, then it is concluded that the model has the outliers.

7) standardized residual errors are assessed. They are used to check whether the normality assumptions are met. The most commonly studied
standardized residues histogram, which is compared with the normal curve, standardized residual errors curve, and the normal random variable relative percentages of frequencies (P-P plot). If the points are drawn closer to the line, the data is considered as normal. Standardized errors sanity is checked using Shapiro and Wolf, Kolmogorov and Smirnov tests. If these criteria p-values are greater than 0.05, it can be stated that the standardized errors are normal.

8) autocorrelation is assessed. Autocorrelation is not considered if Durbin-Watson's statistical significance is in the range of 1.5–2.5. It can be stated that the observations are auto correlated, if Durbin-Watson statistical significance is close to 0 or 4.

In order to calculate the company's intellectual capital aggregated index or its components change, the company's market value change during the research period, the value of present year is divided by the value of previous year and deducted by one. The resulting figure is expressed as a percentage.

Hypotheses are confirmed if the resulting regression models are statistically significant and consistent with the criteria specified above. If the resulting regression models are not statistically significant, the null hypothesis is accepted, which means that there is no statistically significant relationship between a company’s intellectual capital and its market value.

To sum up, the company’s intellectual capital evaluation model is composed and checked using exploratory factor analysis. In order to check if there is a statistically significant relationship between a company’s intellectual capital and its market value, a pair-wise and multiple correlation and regression analysis is conducted. The empirical test of the latter model has been checked for Baltic companies (Estonia, Latvia, and Lithuania) listed in Nasdaq Baltic stock exchange. The weights of the company’s intellectual capital structural parts were determined using an experts’ evaluation. The results of the abovementioned research are presented in the next paragraph.

The Empirical test of a model of company’s intellectual capital and its impact on the market value

The data was collected using companies that are listed in Nasdaq Baltic stock exchange. According to the information provided in the platform, there were 17 Estonian listed companies, 27 Latvian listed companies, and 28 Lithuanian listed companies. Some of the companies were removed from the research due to discrepancies in the data or data absence. The empirical test of the company’s intellectual capital and its market value
model was checked using five years’ data from 2011 to 2015. The more recent data was not available. For some of the listed companies (“LHV Group”, “Linda Nektar”, “Pro Kapital Grupp”, “Baltic Telekom”, “HansaMatrix”, “Amber Grid”, “Energijos Skirstymo Operatorius”, “INVL Baltic Farmland”, “INVL Baltic Real Estate”, “INVL Technology”, “K2 LT”), old data records were not present as some of them were newly established. One company was removed from the research due to the fact that no employees were present in it (“Trigon Property Development”). In total, 13 Estonian listed companies, 24 Latvian listed companies, and 21 Lithuanian listed companies were included in the empirical test. All companies that were selected are listed in Nasdaq Baltic stock exchange and meet the criteria of the listing agreement. The companies are from various sectors as follows: travel and leisure industry, retail, telecommunications, banks, health care, financial services, media, chemicals, construction and materials, basic resources, automobiles and parts, food and beverage, real estate, personal and household goods, industrial goods and services, and utilities. All companies belong to the small capitalization group.

The results of the Baltic listed companies’ intellectual capital index revealed that the greatest values of intellectual capital were in Estonian listed companies (Table 3).

The results (Table 3) show that lower-than-average intellectual capital aggregated index value is in Lithuanian and Latvian listed companies. It is appropriate to consider how intellectual capital index values are distributed among the industry level (Figure 5).

The graph (Figure 5) shows that the aggregated index of intellectual capital values is the highest in companies that work in the travel and leisure industry. Other industries in which the aggregated index of intellectual capital values are higher than the average: retail, telecommunications, banks, health care, financial services, media, chemicals and construction and materials. It was also detected that the lowest intellectual capital aggregated index values are in companies that belong to the basic resources industry. Other industries where intellectual capital aggregated index value is lower than the average are as follows: automobiles and parts, food and beverage, real estate, personal and household goods, industrial goods and services, and utilities. It is worth noting that Estonian companies belong to the travel and leisure industry and earlier the research showed that the Estonian companies’ intellectual capital aggregated index value is the highest.

The analysis of the structure of the intellectual capital index revealed that companies where intellectual capital aggregated index is high, have one commonality: their human capital and relational capital constitute the largest part of intellectual capital. For instance: it was identified that the
company, in which the value of intellectual capital is largest (Estonian travel and leisure company “Tallink Grupp”), structural capital is less than the average of the Baltic countries. It can be concluded that structural capital reduces the aggregate value of the intellectual capital index. It was also detected that the companies, where human capital takes up the major part, have higher values of the aggregate intellectual capital index.

The final part of the research was to check if there is a statistically significant relationship between a company’s intellectual capital and its market value. The results are provided in the scheme below (Figure 6). The final results are provided in the annex (Table 4).

The results of the abovementioned research revealed that there is a statistically significant relationship between a company’s intellectual capital and its market value in the Baltic listed companies. This is represented by the regression model which is given in the formula below (Formula 1).

\[
BSLCMV = 72275 + 65191HC - 17450SC + 1172JC + 15424RC, \quad (1)
\]

where:
BSLCMV – Baltic States’ listed companies’ market value;
HC – company’s human capital;
SC – company’s structural capital;
JC – company’s juridical capital;
RC – company’s human capital.

It was detected that the Baltic listed companies with a higher intellectual capital aggregated index value have a higher market value (in these enterprises intellectual capital explains 58 per cent of their market value variation). The analysis of the regression model was also conducted separately for the three Baltic countries as well. It was found that in all of the Baltic countries, the regression model is statistically significant. In the case of Latvia, the intellectual capital and market value dependence are best reflected by the exponential model that explains 61 per cent of their market value variation. In the case of Lithuania, the intellectual capital and market value dependence are best reflected by the sixth-degree polynomial equation that explains 28 per cent of their market value variation. What is more, graphically displayed variables showed that Lithuanian and Latvian companies were divided into two groups. In one group companies with similar intellectual capital index values have high market value, while others have smaller market value. These differences showed that intellectual capital in various enterprises can be utilized differently.

The second regression model was also statistically significant, and it was identified that the Baltic listed companies’ market value depends not
only on the intellectual capital aggregated index values but also on the intellectual capital structural parts. The model explains 45 per cent of the Baltic listed companies market value variation. The examination of the second regression model separately for three Baltic countries revealed that in all three countries, the criteria established for the models were statistically significant. For Estonia, the greatest impact on the market value of listed companies has human capital, for Latvia — structural capital. However, in this case, the structural capital factor regression coefficient was negative, which led to the conclusion that the company’s structural capital increase is followed by the market value decrease. The importance of structural capital was accentuated in other studies by various researchers, but the results they obtained were similar to this (Maddocks & Beaney, 2002, pp. 16–17; Kannan & Aulbur, 2004, pp. 389–414; Znakovaitė & Pabedinskaitė, 2010, pp. 126–133; Stankevičienė & Liučvaitienė, 2012, pp. 79–93). There might be two main concerns that arise from such results: not proper evaluation of company’s structural capital or the difficulty to measure the structural capital on its overall basis. This phenomenon is analysed in the discussion and recommendations part. In the case of Lithuania, only human capital was included as a statistically significant variable.

In general, it was observed that human capital and relational capital have the largest influence for the market value of listed companies. In enterprises where structural capital represents a major intellectual capital aggregated index part, a lower level of intellectual capital was observed.

Discussion and recommendations

The results revealed that there is a statistically significant relationship between a company’s intellectual capital and its market value. Human capital plays a major role in the market value of listed companies in the Baltic States. The results are consistent with Chen et al. (2005, pp. 159–176), Wang (2008, pp. 546–563) and Shakina and Barajas (2014, pp. 861–881) studies that revealed that the company’s intellectual capital has an impact on its market value, and human capital has the greatest impact on the company’s market value. However, other researchers’ (Firer & Williams, 2003, pp. 348–360; Rahman, 2012, pp. 46–77; Shiu, 2006, pp. 356–365; Ting & Lean, 2009, pp. 588–599; Zéghal & Maaloul, 2010; 2011, pp. 39–60, pp. 262–274; Nimtrakoon, 2015, pp. 587–618; Zhang et al., 2006, pp. 10–17) studies were based on the assumption that the company’s intellectual capital operates in efficient markets. Companies with higher intellectual capital have been found to have a higher market value. The practical significance
of research results is revealed by the peculiarity of the company’s intellectual capital influence on its market value valuation model, which allows to study the company’s intellectual capital in a complex way, to compare the intellectual capital of individual companies, its components and their influence on their market value. The study revealed the uneven influence of the company’s intellectual capital components. The results showed that companies with human capital that is higher than average are characterized by an increase in the number of employees, the number of employees and the share of personnel costs. The results showed that companies with structural capital which is higher than average, has a low debt-to-equity ratio and high strategy implementation rates. Nevertheless, interesting result requires more research and studies: the structural capital factor regression coefficient was negative, which led to the conclusion that the company’s structural capital increase is followed by the market value decrease. The results are consistent with some other studies (Maddocks & Beaney, 2002, pp. 16–17; Kannan & Aulbur, 2004, pp. 389–414; Znakovaitė & Pabedinskaitė, 2010, pp. 126–133; Stankevičienė & Liučvaitienė, 2012, pp. 79–93). The phenomenon can be explained with more future research as the main issue is that companies do not have a measurement system of their structural capital. This leads to the improper evaluation of company’s structural capital which can result in incorrect structural capital and company’s market value ratio. In addition to this, companies where juridical capital is higher than average focus on increasing intangible assets with a higher number of patents, licenses, and brands. Current studies (Sachpazidu-Wójcicka, 2017, pp. 287–299) also suggest that innovation, technology, product and process innovations are important elements for the success of any enterprise. Also, the results have revealed that in companies where relational capital is higher than average there is an increase in marketing costs, companies have one of the largest citations in search engines, their website quality and social networking indicators are very high.

It would be appropriate to develop research into ways to incorporate additional indicators that reflect the company’s intellectual capital or its components. Only the most important and most characteristic indicators of the company’s intellectual capital were included in the model, but it would be useful to analyze which additional indicators could be included in the model for the creation of the aggregate index of intellectual capital.

Another limitation was the lack of data — the data of longer time series of listed companies of the Baltic States were not available, so it would be recommended to repeat the study. The study can also be conducted in other homogeneous groups of companies to verify the validity of model not only in the Baltic listed companies. It is worth to study the intellectual capital of
other countries and other types of companies and to analyze which components of intellectual capital have the greatest influence on the market value.

The current model can be used by business executives, stock exchange representatives, business analysts in order to monitor intellectual capital in individual companies. Continuous monitoring of the company’s intellectual capital would make it possible to develop a strategy for the development of the intellectual capital and their components in various companies. It would be appropriate to include in the model indicators that are not publicly available, but companies can calculate them individually. Testing such models would be valuable because they would reveal the importance of items that are not included in the companies’ financial statements, websites, social networks, or other media.

It would also be advisable to develop a model by incorporating qualitative factors into it. One of the most important elements of human capital is employee motivation, but the indicator that reflects it has not been found. Current studies (Vlaseková & Mura, 2017, pp. 111–130) on employee motivation suggests that “enterprise managers should recognize that motivation is personal, as Maslow and Herzberg demonstrated that employees are motivated by many different factors. Enterprise managers therefore need to find out the personal goals of their employees.” It would also be appropriate to be able to assess the value of one of the elements of the communication capital — customer satisfaction. Studies conducted currently (Skvarciany et al., 2018, pp. 7–28) revealed the importance of customers’ trust for a successful competitiveness and attraction of new customers. However, these indicators are not publicly available and not all companies tend to collect data on them. However, it should be emphasized that such research would be useful in assessing the impact and weight of qualitative indicators on the aggregate index of a company’s intellectual capital.

The study was conducted in small capitalization companies, but the impact of the company’s intellectual capital on its market value in medium and high capitalization companies was not investigated. Also, as the study identified a similar structure of intellectual capital, the data could be compared across industries. Such research would be useful in identifying whether intellectual capital has a statistically significant impact on market value in different capitalization firms and in different industries.

Conclusions

To conclude, although the company’s intellectual capital is a relevant and essential concept, various scientists analyze it through different features,
take into consideration various components or interfaces. The research in the company's intellectual capital area is full of different terms (concepts), a variety of intellectual capital structure models, and different intellectual capital research methods. After analyzing the company's intellectual capital concept, a definition of a company's intellectual capital was suggested, namely, the aggregate of intangible resources a company has at its disposal that enables a company to operate at its best, creates a competitive advantage, and increases market value. Intellectual capital structure in this scientific paper is proposed as follows: human capital, structural capital, juridical capital, and relational capital.

Company's intellectual capital evaluation model was composed and checked using exploratory factor analysis. The main aim was to check if there is a statistically significant relationship between a company’s intellectual capital and its market value. To accomplish the latter aim, a pair-wise and multiple correlation and regression analysis was conducted. The empirical test of the company’s intellectual capital and its market value model was checked in 58 Baltic companies (Estonia, Latvia, and Lithuania) listed in Nasdaq Baltic stock exchange. The weights of the company’s intellectual capital structural parts were determined using an experts’ evaluation. The results showed that there is a statistically significant relationship between a company’s intellectual capital and its market value in the Baltic listed companies. It was detected that the Baltic listed companies with a higher intellectual capital aggregated index value have a higher market value. The results have also revealed that the company's structural capital increase is determined by the market value decrease. Human capital and relational capital showed to have the largest influence on the market value of listed companies. In enterprises where structural capital represents a major intellectual capital aggregated index part, a lower level of intellectual capital was observed.

For future research, it would be appropriate to develop the model further in finding ways to involve the company's intellectual capital qualitative and subjective elements. In the model presented in this scientific paper only the most important indicators were included. The limitations were presented in the discussion and recommendations part, but the most important area of opportunity is to proceed further with supplementary research by using additional factors that would describe company’s intellectual capital. It would be useful to include various individual criteria of the respective companies. Human capital is considered as the most important structural part of the company’s intellectual capital, but the major element of it — motivation of employees — was not included. It would be good to examine the latter indicator, but by now none of the companies has been willing to
publicize this information. Nevertheless, it would be valuable to test these kinds of patterns as they reveal the elements that are not presented in the financial statements of companies.

References


## Annex

**Table 1. Intellectual capital definitions provided by multiple researchers**

<table>
<thead>
<tr>
<th>The development stage</th>
<th>Intellectual capital definition</th>
<th>Researcher, year</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Forming</strong></td>
<td>Intellectual capital is the effects of dynamic individuals’ intellect.</td>
<td>Galbraith (1969)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital is an invisible element, which has a visible benefit.</td>
<td>Cooper &amp; Sherer, (1984, pp. 998–1020)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital is technologies, brand name, and knowledge capital, which belong to a company.</td>
<td>Itami &amp; Roehl (1987, p. 186)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – a set of contemporary value criteria, which productively transforms resources into material assets.</td>
<td>Hall (1992, pp. 135-144)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – knowledge assets, non-financial assets, intangible assets, hidden assets, which belong to a company.</td>
<td>Edvinsson &amp; Malone, (1997, p. 217)</td>
</tr>
<tr>
<td><strong>Storming</strong></td>
<td>Intellectual capital – the sum of everything that belongs to a company and is understood as a competitive advantage; intellectual datum such as knowledge, experience, intellectual property, information that is used for the creation of wealth.</td>
<td>Stewart (1997, p. 265)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – the bunch of all intangible assets in a company.</td>
<td>Bontis (1998, pp. 63–76)</td>
</tr>
<tr>
<td><strong>Norming</strong></td>
<td>Intellectual capital is a twin of knowledge management.</td>
<td>Sveiby (2001, pp. 344–358)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – the holistic ability of a company to coordinate, align, and maintain knowledge resources during the wealth creation process.</td>
<td>Rastogi (2003, pp. 227–248)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital is a set of essential value creation criteria.</td>
<td>Wang (2008, pp. 546–563)</td>
</tr>
<tr>
<td><strong>Performing</strong></td>
<td>Intellectual capital is a complicated network of knowledge, which belongs to a company.</td>
<td>Dumay &amp; Cuganesan (2011, pp. 24–49)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital is a phenomenon that enables activate intangible assets related to knowledge resources created by employees, clients, technologies, and processes.</td>
<td>Montemari &amp; Nielsen (2013, pp. 522–546)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – a dynamic aggregate of competencies and abilities created by a company due to a specific knowledge stream, intangible assets, and competitive advantages.</td>
<td>Dumeri &amp; Ricciardi (2015, pp. 860–887)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – hidden assets and knowledge-based resources of company members.</td>
<td>Inkinen (2015, pp. 518–565)</td>
</tr>
<tr>
<td></td>
<td>Intellectual capital – a competitive advantage of a company composed of knowledge, experience, intellectual property, information used for value creation.</td>
<td>Dumay (2016, pp. 168–184)</td>
</tr>
</tbody>
</table>
**Table 2.** The weights of a company’s intellectual capital structural parts

<table>
<thead>
<tr>
<th></th>
<th>Human capital</th>
<th>Structural capital</th>
<th>Juridical capital</th>
<th>Relational capital</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>39%</td>
<td>19%</td>
<td>17%</td>
<td>25%</td>
</tr>
</tbody>
</table>

**Table 3.** Deviation from the mean of the Baltic listed companies’ intellectual capital aggregated index (2011–2015)

<table>
<thead>
<tr>
<th>Country</th>
<th>Latvia</th>
<th>Lithuania</th>
<th>Estonia</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>-0.165</td>
<td>-0.072</td>
<td>0.420</td>
</tr>
</tbody>
</table>

**Table 4.** The results of the modified multi-regression model of the evaluation of intellectual capital influence of listed companies of Estonia, Latvia and Lithuania on their market value

<table>
<thead>
<tr>
<th>Criteria</th>
<th>Estonian listed companies</th>
<th>Latvian listed companies</th>
<th>Lithuanian listed companies</th>
</tr>
</thead>
<tbody>
<tr>
<td>Pair correlation coefficients</td>
<td>HC = 0.790</td>
<td>RC = 0.694</td>
<td>HC = 0.502</td>
</tr>
<tr>
<td></td>
<td>SC = -0.419</td>
<td>RC = 0.473</td>
<td>SC = 0.000</td>
</tr>
<tr>
<td>Level of significance of correlation coefficients</td>
<td>HC = 0.000</td>
<td>RC = 0.000</td>
<td>HC = 0.000</td>
</tr>
<tr>
<td>Determination coefficient ($R^2$)</td>
<td>0.667</td>
<td>0.385</td>
<td>0.432</td>
</tr>
<tr>
<td>ANOVA p</td>
<td>0.000</td>
<td>0.000</td>
<td>0.000</td>
</tr>
<tr>
<td>Cook’s distance</td>
<td>0.019</td>
<td>0.013</td>
<td>0.020</td>
</tr>
<tr>
<td>VIF</td>
<td>HC = 1.903</td>
<td>RC = 1.903</td>
<td>HC = 1.586</td>
</tr>
<tr>
<td></td>
<td>SC = 1.071</td>
<td>RC = 1.540</td>
<td></td>
</tr>
<tr>
<td>Histogram of standardized residues</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>P-P</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Diagram of Standardized Residue and Regression Estimated Values</td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>
Table 4. Continued

<table>
<thead>
<tr>
<th>Criteria</th>
<th>Estonian listed companies</th>
<th>Latvian listed companies</th>
<th>Lithuanian listed companies</th>
</tr>
</thead>
<tbody>
<tr>
<td>Shapiro–Wilk test</td>
<td>0.002</td>
<td>0.000</td>
<td>0.000</td>
</tr>
<tr>
<td>Kolmogorov–Smirnov test</td>
<td>0.000</td>
<td>0.001</td>
<td>0.000</td>
</tr>
<tr>
<td>Durbin–Watson statistic</td>
<td>0.865</td>
<td>0.546</td>
<td>0.508</td>
</tr>
<tr>
<td>Student's t-test</td>
<td>HC = 0.000</td>
<td>HC = 0.003</td>
<td>HC = 0.000</td>
</tr>
<tr>
<td></td>
<td>RC = 0.006</td>
<td>SC = 0.000</td>
<td></td>
</tr>
<tr>
<td>Standardized Variables Beta Coefficients</td>
<td>HC = 0.593</td>
<td>HC = 0.277</td>
<td></td>
</tr>
<tr>
<td></td>
<td>RC = 0.286</td>
<td>SC = -0.302</td>
<td></td>
</tr>
<tr>
<td></td>
<td></td>
<td>RC = 0.252</td>
<td></td>
</tr>
</tbody>
</table>

Figure 1. The development stages of the Intellectual Capital concept

Source: own assumptions based on Tuckman’s (1965) group/team formation theory stages.
**Figure 2.** The structure of the intellectual capital of a company

Source: adapted in accordance with Stewart (1997, p. 265).
**Figure 3.** The stages of a company’s intellectual impact on its market value research methodology

<table>
<thead>
<tr>
<th>I stage</th>
<th>Company’s intellectual capital components model is chosen</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Company’s intellectual capital evaluation model is formed</td>
</tr>
<tr>
<td></td>
<td>Company’s intellectual capital evaluation method is chosen</td>
</tr>
<tr>
<td></td>
<td>Company’s intellectual capital elements are chosen and evaluation</td>
</tr>
<tr>
<td></td>
<td>The aggregation method of a company’s intellectual capital valuation indicators is selected</td>
</tr>
<tr>
<td></td>
<td>Research sample and period is defined, data is collected</td>
</tr>
<tr>
<td></td>
<td>The evaluation system validity and reliability of a model is checked</td>
</tr>
<tr>
<td></td>
<td>A model of company’s intellectual capital is modified</td>
</tr>
<tr>
<td></td>
<td>Company’s intellectual capital components weights are determined</td>
</tr>
<tr>
<td></td>
<td>Variables are aggregated, the value of company’s intellectual capital is calculated</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>II stage</th>
<th>Hypotheses are formulated, the methods of investigation are described</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Models of company’s intellectual capital impact on its market value are described</td>
</tr>
</tbody>
</table>
Figure 4. Company’s intellectual capital evaluation model

- Human capital
  - Number of employees
  - Education of employees
  - Ratio of costs of employees
  - Costs per employee

- Structural capital
  - Financial leverage
  - Company’s age
  - Strategy implementation
  - SG&A

- Juridical capital
  - Patents, licences, trademarks
  - Intangible assets
  - Number of subsidiaries
  - Company’s web site quality

- Relational capital
  - Relational expenses
  - Citations in search engines
  - Social networks

Figure 5. Deviation from the mean of the Baltic listed companies’ intellectual capital aggregated index by industry level (2011–2015)
Figure 6. Final Baltic states listed companies’ intellectual capital and its market value regression models