## The role of intellectual capital on innovation: Evidence from **Hungarian SMEs**

El papel del capital intelectual en la innovación: Evidencia de las PYMEs Húngaras

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#### • Article received:

06 January, 2023

- Article accepted: 08 March, 2023
- Published online in articles in advance: 17 April, 2023

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DOI: https://doi.org/10.18845/te.v17i2.6695

**Abstract:** This study investigates the relationship between intellectual capital components and innovation on a sample of 1243 Hungarian small and medium sized enterprises (SMEs) drawn from the Global Competitiveness Project (GCP). The results of the logistic regressions reveal a significantly positive effect of structural capital and relational capital on innovation, whereas the impact of human capital is not significant. The results show the importance for entrepreneurs of strengthening intellectual capital in order to increase SMEs innovation, and advise policymakers on how to mobilize support schemes for the renewal of SMEs with low individual but high collective innovation potential. Instead of examining large enterprises and startups, the novelty of the study relies on the analysis of the connections between intellectual capital components and innovation in the context of mature Hungarian SMEs.

Keywords: Innovation, intellectual capital, SMEs, Hungary.

**Resumen:** El estudio investiga la relación entre los componentes del capital intelectual y la innovación en una muestra de 1243 pequeñas y medianas empresas (PYME) Húngaras extraída del Proyecto de Competitividad Global (GCP). Los modelos de regresión logística revelan un efecto positivo y significativo del capital estructural y el capital relacional sobre la innovación, mientras que el impacto del capital humano no es significativo. Los resultados muestran la importancia que tiene para los empresarios fortalecer el capital intelectual para aumentar la innovación de las PYMEs, y brindan una guía a los responsables políticos sobre cómo movilizar planes de apoyo para la renovación de PYMEs con bajo potencial innovador individual pero elevado potencial innovador colectivo. En lugar de examinar grandes o nuevas empresas, la novedad del estudio surge del análisis de las conexiones entre los componentes del capital intelectual y la innovación en el contexto de las PYMEs maduras localizadas en Hungría.

Palabras clave: Innovación, capital intelectual, PYMEs, Hungría

### **1. Introduction**

In Hungary – similarly to a number of other European Union countries – governmental efforts to foster innovation are primarily directed at enabling the activities of large enterprises, or other innovation-related organizations (e.g., higher education institutions, research centers) that are well endowed with innovation resources and capabilities (European Commission, 2016, pp. 38-58). This means that the micro-, small-, and medium-sized enterprises (SMEs), which are also crucial actors of the innovation ecosystem, often fall outside the scope of these efforts (Tian et al., 2020). This governmental approach represents an outdated view in the sense that the production of codified, research and development (R+D) based knowledge (Science, Technology and Innovation, STI) is indeed primarily tied to large enterprises, and organizations with high R+D+I budgets (Jensen et al., 2007). Simultaneously, SMEs play a leading role in the type of innovation that is based on the knowledge obtained from work processes, usage and interactions (Doing, Using and Interacting, DUI) (Parrilli & Heras, 2016).

In this study we argue that Hungary should rely more extendedly on the decentralized innovation resources and capabilities available in the SME sector. Even when such governmental intentions arise occasionally, interest is primarily vested in the young companies with great growth potential founded in response to the initiative, while the renewal of more mature, established enterprises with considerable DUI experience rarely appears as a priority (also in the literature) (Almus & Czarnitzki, 2003; Dai & Cheng, 2015). One reason for the importance of their support is the fact that they work in a familiar environment. Their incremental innovation activity poses lower risks, since they have learned how to recognize which of their projects are likely to fail, and as such are able to complete them sooner. They have in their possession a more diversified portfolio relative to startups that further decreases the uncertainty surrounding innovation (Coad et al., 2016). DUI innovation requires a completely different policy support regime, since instead of the direct innovation funding that often concerns physical resources, it recognizes human resources as the most important element of business renewal.

In this study we set out to showcase the innovation performance of Hungary and examine the relationship between the intellectual capital components and innovation by relying on the GCP dataset of 1,243 mature Hungarian SMEs, including 456 SMEs reporting innovation outcomes.

The novelty and relevance of the study are the following:

- This study constitutes the first attempt to analyze the relationship between intellectual capital and innovation among Hungarian SMEs using the GCP dataset.
- The results enrich our knowledge regarding the mechanism through which intellectual capital and its components impact the innovation of SMEs.
- Unlike in the case of the main body of literature concerning the innovation of SMEs, mature enterprises are the focus of this study, as opposed to young startup businesses.
- Comparing to other studies concerning SME intellectual capital, our analysis is conducted on a relatively large sample.

Based on the recommendations of the latest intellectual capital publications, we focus on SMEs and not on large companies, the innovation context of impact mechanisms, and on the individual components of intellectual capital (e.g., Agostini & Nosella, 2017; Agostini et al., 2017; McDowell et al., 2018).

Moving on, we first discuss intellectual capital, its individual components, and its role on SMEs' innovation activity. Second, we examine the innovation performance of Hungarian enterprises from a macro perspective based on the widely known and cited Community Innovation Survey (CIS) and European Innovation Scoreboard data (EIS). Third, we show the interrelationships of intellectual capital and innovation, as well as the areas of innovation in terms of existing/new products/ services and existing/new technologies, their intensity, and success rate at the micro level using the data contained within the GCP dataset of 1,243 Hungarian SMEs.

### 2. Literature review and hypotheses

Similar to other complex social science concepts, intellectual capital has no generally accepted definition. The seminal study of Nahapiet and Ghoshal (1998) defines intellectual capital as 'the knowledge and knowing capability of a social collectivity' (p.245). The omnipresent concept of knowledge is defined by Marshall (2009) as 'our most powerful engine of production' (p. 99), to which everyone's work contributes. In the business context, two types of knowledge have been identified: explicit and tacit knowledge. Explicit knowledge is coded, and therefore easier to pass on, while tacit knowledge is implicit, and therefore difficult to identify or to disseminate (Edvinsson & Sullivan, 1996). However, to be able to generate value for the company, the sources of knowledge must be continuously and actively identified (Lerro et al., 2014). The literature treats knowledge as a type of intangible asset, which represents value for the company (Kaufmann & Schneider, 2004). Knowledge could also be viewed as a type of intangible asset representing value for the firm (Kaufmann & Schneider, 2004). Since the value is difficult to grasp or to define in material terms, intellectual capital measurement is complicated. The risk associated with such intangible assets is generally higher than with classic tangible assets. As such, most professionals are reluctant to include immaterial or intellectual capital in reports alongside physical and financial assets (Gu & Lev, 2010).

Intellectual capital components include human capital, structural capital, and relational capital (Harangozó, 2007; Obeidat et al., 2021). Structural capital refers to the elements of knowledge in the company that are unrelated to humans. Relational capital represents the elements of knowledge obtained from the network of the company. Human capital denotes knowledge acquired by the individuals that positively contributes to both corporate value creation and individual performance. It is also closely related to the individual in possession of it, the organization cannot own it (Sveiby, 1997). Irrespective of whether the company operates in a knowledge intensive industry, the recognition and management of the knowledge embedded within the enterprise is vital for its long-term survival (Montequín et al., 2006). The management of intellectual capital represents a challenge for company executives; with the right strategy it opens up new avenues for company management, profit realization, and technology adoption, and could become an important source of competitiveness for enterprises (Obeidat et al., 2021).

The contents of the individual components of intellectual capital are showcased in Table 1 in detail. Table 1 also serves to identify the components of the intellectual capital of Hungarian SMEs included in the sample (Appendix 1), and to enable the empirical study of their characteristics in the later chapters of the study.

So far, our emphasis has been on knowledge gains. However, in practice the key to success is the ability to innovate, or how the business could utilize this internal and external knowledge. This capability is called absorption (Cohen & Levinthal, 1990; Akhmetshin et al., 2017). Based on the CEDEFOP (2012) report, absorption capability is determined by the already known intellectual capital (Alvino et al., 2020; Obeidat et al., 2021; Mirza et al., 2022). Knowledge, both STI or DUI based, is the precondition for innovation that is mainly affected by the practical experiences and training of the employees, managers and owners. Organizational culture determines how the company is able to respond to novelty. In the absence of appropriate, receptive culture, and in the case of organizational resistance, attempts at innovation often wither away (Crepon et al., 1998; Lööf & Heshmati, 2006).

Human capital	Structural capital	<b>Relational capital</b>
Expertise	Organizational culture	Relationship with customers
Practical experience	Quality of cooperation and communication within the organization	Relationship with suppliers
Social competencies	IT-infrastructure (hardware and software)	Relationship with investors/owners
Motivation	Knowledge transfer and knowledge retention	Relationship with external educational institutions
Leadership competencies	R+D infrastructure related to product development	Acquisition of external knowledge
Personal skills and competencies	R+D infrastructure related to process innovation	Social responsibility
Continuous professional training	Organizational structure	Corporate image
Training of new entrants	Organizational processes	Relationship with other social and economic actors
Participation in higher education	Usage of information and communication technologies	
Participation in other forms of education	Organizational forms that support learning	
	Source: based on ICEDEEOP 2012 n 23	

#### Table 1: Components of intellectual capital

Source: based on (CEDEFOP, 2012, p.23).

Besides the internal business determinants, external actors also play a marked role in innovation. Relationships with external actors (buyers, suppliers, competitors, different agencies, supporting organizations, etc.) provide the requisite information and knowledge for innovation. Network relationships are often able to compensate for the lack of resources that are particularly important in the case of resource-constrained small enterprises (Cohen & Levinthal, 1990).

Innovation activity is by itself the primary determinant of innovation together with strong competition, technological investments, and the need for the optimization of internal processes. Innovation activity is determined by two things, the ability to innovate and absorption, irrespective of whether the subject of innovation are the goods/services, production of goods/provision of services, the applied financial, marketing, management, and other methods or business models of the company (Cohen & Levinthal, 1990; Akhmetshin et al., 2017). Recent studies reinforce that the ability to innovate, and absorption are positively related to changes in the intellectual capital components of the company (Alvino et al., 2020; Obeidat et al., 2021; Mirza et al., 2022).

SME literature has examined intellectual capital in terms of various contexts. Some have identified the positive relationship between innovation and the intellectual capital components (e.g., Agostini & Nosella, 2017; Agostini et al., 2017). Others have observed that intellectual capital has a direct effect on business performance (e.g., McDowell et al., 2018; Khan et al., 2019; Beltramino et al., 2021; Adusei et al., 2022; Bansal et al., 2022), organizational climate (Dabić et al., 2018), internationalization (e.g., Reza et al., 2021; Villanueva-Flores et al., 2022), growth (e.g., Eklund, 2020; Dimitrov & Cozzarin, 2021), sustainable development (Alvino et al., 2020), competitiveness (Obeidat et al., 2021), and resilience (Agostini & Nosella, 2022).

In the following we focus on studies that examine the interrelationships between intellectual capital and its components and SME innovation. Agostini et al. (2017) demonstrated a positive relationship between the intellectual capital components and innovation performance based on a sample of 150 manufacturing SMEs in the medium- and high-tech industries. McDowell et al. (2018) uncovered a relationship between human capital and organizational capital and organizational performance that was mediated by innovation. Agostini and Nosella (2017) established through the examination of 150 machine- and instrument-producing Italian SMEs that human capital is directly related to radical innovation, however its effect is moderated by the other two components. They found that organizational capital positively moderates the relationship between relational capital and radical innovation. Agostini and Nosella (2017) also observed the positive impact of intellectual capital on innovation and organizational performance based on a sample of 259 Argentine manufacturing SMEs. Dabić et al. (2018) captured the positive relationship between intellectual capital components and innovation through the lens of innovation culture based on a sample of 253 Croatian SMEs. Adusei et al. (2022) concluded through the examination of 244 Ghanaian SMEs that innovative leadership attitude and organizational ambidexterity simultaneously mediate the relationship between intellectual capital and performance. In the case of 170 Iranian SMEs, Hayaeian et al. (2021) found that intellectual capital is positively related to innovation, however, the effect of the human capital component only proved significant in the case of radical innovation, and not in the case of incremental innovation.

Based on the empirical literature we formulate the following hypotheses:

Hypothesis 1: The intellectual capital is positively related to SME innovation.

Hypothesis 2: The human capital component of intellectual capital is positively related to SME innovation.

Hypothesis 3: The structural capital component of intellectual capital is positively related to SME innovation.

Hypothesis 4: The relational capital component of intellectual capital is positively related to SME innovation.

In addition, we can also examine the relationship between small, family-owned enterprises and innovation. We now know that family businesses unequivocally differ from their non-family-owned counterparts in terms of both performance and the ways of operation and management (Miller et al., 2007; Poza & Daugherty, 2014). Therefore, another examination is worthwhile. Lately, inquiries into the innovation activity of this type of enterprise has received outstanding attention from researchers (Rovelli et al., 2021), and the results have shown that family-owned small enterprises are among the most innovative ones (Rondi et al., 2019).

### 3. The innovation performance of Hungary

It is widely known that there is an ongoing digitalization driven technological revolution is going on all around the world. Traditional knowledge transfer has been superseded by international, cooperation based, common knowledge creation. Innovation systems are globalizing to an increasing degree. At the same time, the Schumpeterian creative destruction (Schumpeter, 1943), described by the explosive growth of new industries and technologies also leads to the disappearance of traditional industries. These changes challenge traditional economic policy makers, especially in those countries where innovation systems perform less efficiently. Hungary falls into this category. In the following section let us review the performance of Hungary based on the measurements of the European Union's (CIS) and (EIS).

The share of innovative businesses in the EU – employing more than 11 employees – is summarized by CIS (2020). Based on the latest data from 2020 (Table 2), 48.5% of small businesses in the EU with 11-49 employees were innovating, while 79.7% of large enterprises implemented some sort of innovation in the three years that preceded the survey. This means that there exists a 1.64 times difference based on firm size. Significant differences exist among countries: there is a nearly seven-fold difference between the leader, Greece (72.6%) and the last Romania (10.7%). Hungary ranks only 25th among the 27 members of the EU, whereby just 29.2% of its businesses employing 10+ employees were considered innovating in 2020. Just over one third of SMEs, and just over half of large enterprises introduced some form of novelty in the three years that preceded the survey that leaves Hungary well

below the EU average. This ranking is worse than the overall innovation performance, where the country achieved somewhat better results.

The EIS report yearly the innovation performance of the EU member countries. In 2022, the overall performance of Hungary was 76.7 points that was 70% the 109.9 points of the EU average (Figure 1). As a result, Hungary ranks 21st, leaving it in the last group of countries, among the emerging innovators cluster. As comparing to other former socialist countries, Hungary ranks ahead of Croatia, Slovakia, Poland, Latvia, Bulgaria and Romania, but lags considerably behind Estonia, Slovenia, Czechia and Lithuania. If we look at the changes over time, the EIS scores averaged around 70-72 points between 2015 and 2018, relative to which a moderate decline took place in 2019. At the same time, between 2020 and 2022, a marked improvement could be observed.

Country	Overall	Small enterprises	Medium enterprises	Large enterprises
Greece	72.6%	71.2%	77.5%	90.7%
Belgium	71.3%	67.7%	82.1%	90.6%
Germany	68.8%	64.1%	78.9%	92.5%
Finland	68.7%	65.3%	76.7%	86.7%
Cyprus	65.8%	63.4%	77.2%	83.3%
Sweden	65.2%	62.8%	72.2%	87.2%
Estonia	64.2%	60.9%	73.9%	92.6%
Austria	60.0%	54.6%	75.6%	89.1%
Denmark	57.7%	56.5%	58.5%	74.9%
Ireland	57.6%	50.7%	61.4%	83.1%
Czechia	56.9%	52.4%	66.6%	83.3%
Netherlands	55.8%	51.9%	67.7%	72.9%
Italy	55.7%	52.8%	70.1%	79.4%
Slovenia	55.2%	50.0%	70.5%	91.8%
Croatia	54.9%	51.7%	65.4%	83.4%
France	54.8%	50.4%	67.8%	83.0%
Lithuania	53.0%	46.2%	72.2%	91.8%
Portugal	51.1%	47.0%	66.5%	85.4%
Luxembourg	45.8%	42.6%	51.1%	73.5%
Malta	41.1%	37.2%	53.7%	76.3%
Slovakia	36.6%	31.2%	47.6%	65.5%
Bulgaria	36.2%	31.1%	50.5%	76.8%
Poland	34.9%	30.0%	47.8%	69.4%
Spain	33.4%	29.0%	51.2%	67.7%
Hungary	32.7%	29.2%	43.7%	56.6%
Latvia	32.0%	28.6%	41.9%	67.2%
Romania	10.7%	9.4%	13.3%	22.6%
EU 27 average	52.7%	48.5%	65.2%	<b>79</b> .7%

Table 2: Share of innovative enterprises within the EU27 countries based on CIS 2020.

Source: CIS 2020.



Figure 1: Innovation performance of the 27 EU members based on the EIS 2022

Note: dark green: innovation leaders; light green: strong innovators; orange: moderate innovators; red: emerging innovators Source: EIS 2022.

Examining the components of the overall EIS innovation performance, it becomes clear that the partial performance of the individual elements is uneven. In the case of linkages, sales impacts, finance and support, attractive research systems and the use of information technologies, the scores are above the 70% average. In the case of linkages, we highlight the ratio of innovative SMEs participating in different cooperation arrangements (83% of the EU average), which is an encouraging value. This positive picture is clouded, however, by the fact that the high value is the result of public-private co-publications,

and not that of innovative SME collaborations. Digitalization, firm investments, and environmental sustainability are around the 70% Hungarian average. However, considerable catch-up is required in the areas of human resources, innovators, intellectual assets, and employment impacts. Interestingly, the issues regarding human resources appear to be more severe than financial problems that is related to the underdeveloped nature of the Hungarian educational system. In the case of the financing position, the low R+D expenditure of the public sector deserves special attention. Critically low score can be observed in the innovator category, where 32.2% of SMEs undertaking process innovation is particularly alarming relative to the EU average. Convergence in the absence of digitalization-based process innovation is hardly conceivable.

Examining the expressly business natured EIS components, we find that the value of in-house product innovators with market novelties is fairly high (88.5%), while the value of in-house market innovators without market novelties, which are not new to the market (53.1%) is low, pointing to an absorption problem, a notion that is reinforced by the value of innovators that do not develop innovations themselves (54.3%). The value of innovation active non-innovators is high (91.6%). However, it seems that these activities do not often lead to the successful introduction of innovations to the market. The value of non-innovators with potential to innovate is outstanding (225.8%) that could indicate motivation problems. The value of in-house business process innovators (29.5%) relative to the EU average is critically low; however, this is hardly surprising given the generally low levels of business process innovation.

The CIS and EIS aggregate the characteristics and determinants of innovation in the EU countries and Hungary from a macro perspective. In the following section, we examine all of this from a micro perspective by utilizing the Hungarian dataset of the GCP, with special emphasis on the analysis of the interrelations of intellectual capital.

# 4. The characteristics and interrelationships of SME innovation and intellectual capital based on the Hungarian dataset of the GCP

In this section, we examine the innovation variables of SMEs and the intellectual capital components that directly and indirectly contribute to innovation activity, based on firm level data. For empirical illustration, we utilize the Hungarian SME dataset of the Global Competitiveness Project (GCP) (https://www.sme-gcp.org/). The data was collected with the help of participating institutions and specialized service providers between 2016 and 2022. The broader aim of the questionnaire was to measure firm level competitiveness based on the performance of individual competencies. The questionnaire placed special emphasis on the assessment of the determinants of the areas and results of innovation, as well as those of intellectual capital as identified by the conceptual model. The entire process of the survey and the construction of the dataset represent methodology under the professional supervision of the GCP (Lafuente, et al., 2020a; Lafuente et al., 2020b). The questionnaire used by GCP teams is homogeneous for enhanced comparability of results. Recent work by Alonso and Leiva (2019), Balogh et al. (2021), Lafuente and Vaillant (2021a), and Lafuente et al. (2021b) corroborate the validity and robustness of the GCP databases.

The course of the survey was the following: After initially establishing communication through the phone, personal meetings took place. In the case of enterprises with less than 20 employees, the respondents were one of the owners involved in the operational management of the firm, and in the case of enterprises with more than 20 employees, one of the leading officials of the SME (irrespective of ownership position). The interviewer of the questionnaire provided support throughout the process, during the course of which closed questions had to be answered almost exclusively. The questionnaire has been widely used since 2013 for research purposes, and as such all ambiguous or misleading questions had already been deleted or corrected before 2016. The incoming data was checked and filtered under a strict procedure. Only companies with all the requisite data available were subjects of subsequent analysis. In connection to this, companies employing less than 5 employees, and those that came under bankruptcy, liquidation in case of solvency, liquidation in case of insolvency,

or involuntary dissolution proceedings before 28th March 2022 were omitted from the list. This process of filtration and preparation resulted in a sample size of n=1,243. Table 3 shows a detailed breakdown of the sample in terms of firm size categories based on the number of employees.

Table 3:         Composition of the sample based on firm size categories (n=1 243)					
SME size categories	Frequency (number of firms)	<b>Relative frequency</b> (%)			
1: smaller sized microbusiness (0-4 employees)	not considered in the present study				
2: larger sized microbusiness (5-9 employees)	386	31.1%			
3: smaller sized small business (10-19 employees)	382	30.7%			
4: larger sized small business (20-49 employees)	382	30.7%			
5: medium business (50-249 employees)	162	13.0%			
Total:	1,243	100.0%			

The average business employs 26.0 employees and has 21.1 years of market experience. 26.3% of companies are active in the industrial sector (construction sector excluded), 13.4% in the construction sector, 28.8% in the retail trade and vehicle repair industries within the tertiary sector, and 31.5% in other service industries within the tertiary sector. The survey included questions related to the areas, intensity, and success rate of the existing/new product/service and existing/new technological innovations in the sense of the Oslo Manual; and the intellectual capital components.

In the sample, 36.7% of the 1,243 SMEs having 5-249 employees undertook activities to improve the existing/new products/services and technologies. The relative frequency of innovative business increases with firm size: Only 28% of the larger sized microbusiness engaged in innovation, the same ratio stood at 33% in the case of the smaller sized small business, 45% in the case of the larger sized small business, and 50% in the case of the medium business. Table 4 provides a detailed breakdown of the areas of these development efforts, based on firm size.

Among the innovative SMEs, the ratio of those that conduct both product/service and technology innovation is 80.2%, so if a business is innovating it is innovating in more than one type. Among the innovating business, product innovation is the most "popular", 92.8% of companies practice it. Moreover, a decisive majority of these business (more than 3/4) is developing their existing and new products simultaneously. Technology innovation is practiced by 84.0% of the 456 SMEs, 71.3% of which strive to both develop existing technologies and to introduce new products/services.

Table 5 shows the success rate of innovation efforts. It can be concluded that approximately 2/3 of initiatives are successful, and that no meaningful difference can be observed between different types of innovation.

Intellectual capital consists of three components based on the CEDEFOP (2012) categorization (in details see Appendix 1). We captured the human capital components through the entrepreneurial capabilities of the leader, employee excellence, and the related human resource management functions. The variables describing the sophistication of production management and quality control systems, the uniqueness and application of ICT assets, information management, decision making, and administrative proceedings are suited for the components of structural capital. For the relational capital factor, we included business development, as well as the external contacts/partners supporting business development and innovation. The average normalized values of the intellectual capital in different size categories are reported in Table 6 (the descriptive statistics of these variables can be found in Appendix 2).

Size category	SAMPLE [Nos]	<b>INNO</b> [%]	Product/service innovators within the size category [%]				gical innova size categoi	
			OEP/S	ONP/S	E&NP/S	OETech	ONTech	E&NTech
5-9 employees	386	28.0%	3.6%	2.1%	1 <b>9.9</b> %	5.4%	2.3%	15.3%
10-19 employees	382	33.0%	4.5%	2.9%	22.3%	<b>7.9</b> %	2.6%	16.0%
20-49 employees	313	45.0%	5.1%	5.4%	31.6%	4.8%	1.6%	31.6%
50-249 employees	162	50.0%	7.4%	1.9%	39.5%	8.6%	3.7%	33.3%
Total	1,243	36.7%	4.7%	3.1%	26.1%	6.4%	2.4%	22.0%

 Table 4: The intellectual capital components and some innovation measures among the innovating SMEs in different size categories (n=456)

Note: INNO: product/service and/or technology innovators; OEP/S: only existing product/service innovators; ONP/S: only new product/service innovators; E&NP/S: existing and new product/service innovators; OETech: only existing technology innovators; ONTech: only new technology innovators; E&NTech: new and existing technology innovators.

Table 5: The success rate of the existing/new product/service and existing/new process innovation (n=456).

Type of innovation	Number of respondents	Average success rate [%]
Existing product/service innovation	293	67.5%
New product/service innovation	221	69.0%
Existing process innovation	252	66.0%
New process innovation	218	65.0%

According to Table 6, the intensity of innovation activity, the outcomes of initiatives, and the level of intellectual capital components all increase with business size. Table 7 presents the Pearson correlation coefficient values of the three intellectual capital components. While human, structural and relational capitals are significantly correlated to each other, the strengths of the correlations are at the medium level.

 Table 6: The intellectual capital components and some innovation measures among the innovating SMEs in different size categories (n=456)

Function/size	5-9 employees	10-19 employees	20-49 employees	50-249 employees	Innovating sample
Intellectual capital	1.777	1.722	1.899	2.016	1.842
Human capital	0.587	0.561	0.595	0.606	0.585
Structural capital	0.622	0.623	0.695	0.766	0.670
Relational capital	0.568	0.539	0.609	0.644	0.586
Intensity of innovation activity	0.495	0.489	0.558	0.597	0.531
Number of inventions	4 (3 firms)	5 (3 firms)	13 (7 firms)	6 (3 firms)	28 (16 firms)
Number of patents	2 (2 firms)	10 (6 firms)	25 (16 firms)	43 (10 firms)	80 (34 firms)
Initiated patent registration in the past 3 years	0 (0 firms)	6 (4 firms)	7 (6 firms)	2 (1 firms)	15 (11 firms)

(1)

(2)

		1	
	Intellectual capital	Human capital	Structural capital
Human capital	0.721		
Structural capital	0.801	0.415	
Relational capital	0.811	0.351	0.466

Table 7: Correlation coefficients between the con	nponents of intellectual capital (n=1,243 SME)
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\* Correlation is significant at the 0.01 level (2-tailed).

### 5. Results and discussion

We used the methodology of binary logistic regression to examine the connections and test our hypotheses (Babbie, 2020). The independent variables are the intellectual capital in *Model 1*, and the three components of intellectual capital in *Model 2*. The dependent variable is a binary variable in both cases, which denotes whether an SME undertakes innovation activity (1=innovates, 0=does-not-innovate). We included the headcount based firm size category, the industry, the firm age, and a binary variable denoting family-owned business in both models as control variables using the ENTER method. We applied logarithmic transformation in the case of firm age (this preserves the ratio of the differences between individual factors), while in the case of the other control variables we constructed dummy variables.

The generic formulas of the binary logistic regressions are shown by Equation 1 and 2 (Pituch & Stevens, 2015):

$$logit(p) = \beta_0 + \beta_1 X_1 + \beta_2 Z_1 + \beta_3 Z_2 + \beta_4 Z_3 + \beta_5 Z_4 + \varepsilon$$

where:

logit(p) = the dependent variable of the logistic regression (the probability that a SME undertakes innovation activity);

X1 = the independent variable of the logistic regression (intellectual capital);

Z1 – Z4 = the control variables of the logistic regression (firm size category, industry, firm age, family-ownership);

 $\varepsilon = error term.$ 

 $logit(p) = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \beta_3 X_3 + \beta_4 Z_1 + \beta_5 Z_2 + \beta_6 Z_3 + \beta_7 Z_4 + \epsilon$ 

where:

logit(p) = the dependent variable of the logistic regression (the probability that a SME undertakes innovation activity);

X1 – X3 = the independent variable of the logistic regression (components of intellectual capital);

Z1 – Z4 = the control variables of the logistic regression (firm size category, industry, firm age, family-ownership);

 $\epsilon = error term.$ 

The general features of Model 1 and 2 (explanatory value, -2 Log likelihood, constant value, sample size) are presented in Table 8.

Independent and control variables		el 1	Мос	lel 2
	Exp(B)	Sign.	Exp(B)	Sign.
Intellectual capital	11.673	0.000	_	-
Human capital	-	-	1.964	0.127
Structural capital	-	-	6.396	0.000
Relational capital	-	-	81.181	0.000
Family dummy	1.017	0.906	0.943	0.682
Size 10-19 headcount SME (5-9 headcount microbusiness)	1.150	0.425	1.146	0.448
Size 20-49 headcount SME (5-9 headcount microbusiness)	1.314	0.140	1.327	0.138
Size 50-249 headcount SME (5-9 headcount microbusiness)	1.081	0.734	1.059	0.812
Sector A: primary and secondary sector without construction (Sector C: retail trade)	2.356	0.000	2.401	0.000
Sector B: construction (Sector C: retail trade)	1.026	0.911	1.060	0.808
Sector D: tertiary sector without retail trade (Sector C: retail trade)	1.148	0.432	1.268	0.185
LN firm age	0.611	0.002	0.581	0.001

#### Table 8: The binary logistic regression results

Model 1: Nagelkerke R2: 0.289 Cox & Snell R2: 0.211 -2 Log likelihood: 1338.700 Constant: -3.544 Model 2: Nagelkerke R2: 0.323 Cox & Snell R2: 0.236 -2 Log likelihood: 1298.809 Constant: -3.009

The  $\chi^2$  values of the omnibus tests calculated for the coefficients of *Model 1* are 295.249, *df* is 9, while p is 0.000. Moreover, the *p* value of the Hosmer and Lemeshow test is 0.962, the correct classification ratio in the classification table improves from 63.3% to 73.0%, therefore the adequate nature of the logistic regression model can be accepted. It is apparent that based on the Nagelkerke *R*<sup>2</sup> value, the model explains 28.9% of the variance.

In the case of *Model 2*,  $\chi^2$  values of the omnibus tests are 335.140, *df* is 11, while p is 0.000. The p value of the Hosmer and Lemeshow test is 0.746, the correct classification ratio of the classification table improves from 63.3% to 73.1%, therefore the adequate nature of the logistic regression model can be accepted in this case as well. Based on the Nagelkerke  $R^2$  value, the model explains 32.3% of the variance.

Based on the empirical results of *Model 1*, intellectual capital is positively related to SME innovation and therefore Hypothesis 1 is confirmed. This result is not new, but rather confirming and it is in line with the findings of most studies cited in the literature review. It is more interesting to look at the relations of the intellectual capital components based on *Model 2*.

Human capital proved to be non-significant, therefore Hypothesis 2 is not confirmed. This is a surprising result, seemingly contradicting to previous studies that have identified a positive relationship (e.g., Agostini et al., 2017; Dabić et al., 2018). Other studies suggest that the effect of human capital is indirect (e.g., Agostini & Nosella, 2017; McDowell et al., 2018), or that it is only salient in the case of certain types of innovation (e.g., Hayaeian et al., 2021).

The relationship of structural capital is significant, as it is 6.396 times more characteristic of innovating SMEs. Based on this result Hypothesis 3 is confirmed. This means that while we were unable to establish the outstanding role of human related elements of knowledge in the sample, we were able to do so in the case of non-human related elements of knowledge. The result is along in line with the majority of the intellectual capital literature (e.g., Agostini & Nosella, 2017; Agostini et al., 2017; Dabić et al., 2018; McDowell et al., 2018; Popa et al., 2021).

The effect of relational capital on innovation is also significant, as it is 81.181 times more characteristic of innovating as compared to non-innovating SMEs. Therefore, Hypothesis 4 is confirmed. The elements of knowledge derived from the network of the business seems to have the strongest effect on innovation out of the three intellectual capital components.

Other studies also confirm the importance of relational capital on innovation (Tsai et al., 2009; Agostini & Nosella, 2017; Agostini et al., 2017; Dabić et al., 2018; Beltramino et al., 2021; Franco et al., 2021; Villanueva-Flores et al., 2022). Since SMEs have no dedicated R+D departments, external support and structured cooperation with academics, researchers, and market participants is particularly important for successful innovation (Cohen & Levinthal 1990; Zajkowska, 2017).

Among the control variables, the family-owned business dummy and firm size categories do not exhibit significant differences, meaning that, after controlling for intellectual capital components, innovativeness is independent of firm size and family ownership, which results do not support the findings of Rondi et al. (2019) in the Hungarian SME sample. In the case of industry, only one instance of a significant result can be observed: relative to the reference variable, there is a greater likelihood of the SMEs executing innovation in the "primary and secondary sector without construction" category. The increase of firm age significantly (with a 0.581 odds ratio) decreases the likelihood of innovation.

### 6. Summary and conclusion

In this study, we have examined the innovation performance of Hungarian SMEs through the combination of macroand micro- level approaches. In particular, we were interested in the effects of intellectual capital components on product and process innovation. While many other studies examined this relationship in large firms or startups, our sample mostly consisted of mature SMEs averaging around 21.1 years of age. Even though the innovation of mature SMEs is individually marginal, altogether SMEs play an important role in the innovation performance of a country. There have been several studies examining the effect of intellectual capital on innovation performance, however, we conducted research that decomposed the intellectual capital into its three components. Especially, relational capital, in a smaller degree structural capital has been found to affect innovation significantly. At the same time, human capital has proved to be insignificant. This surprising finding could be explained by the inappropriate capture of human capital variable from the dataset. It could also happen that SMEs human resources are generally weak in innovation related capabilities. This could be the reason why the relational capital – a potential substitute of lacking own human capital – component is so important in the innovation of Hungarian SMEs.

We did not analyze in detail the age and the effects of industry on innovation. However, our results highlight that younger businesses are more committed towards innovation. This is in line with many other innovation studies. At the same time, we should not forget that mature SMEs could possess valuable resources. Intellectual capital components could counterbalance the negative age effect. Further inquiries are needed to examine the role of intellectual capital components over the different stages of the business life cycle.

Our results have important implications for SME owners and managers about the importance of intellectual capital in innovation. The network of external actors, and the non-human, structural capital elements of knowledge are particularly important for the successful renewal of the businesses. From a policy perspective, the innovation policy regime ought to be extended from the traditional, large firm dominated STI type of support to include DUI focused SMEs. However, further research is necessary to identify appropriate policy support tools and methods.

### Acknowledgement

The research has received financial support from the National Research, Development and Innovation Fund of Hungary Project No. NKFIH OTKA K 131935 "Examining the competitiveness of the Hungarian small businesses".

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### Appendix

Appendix 1: The quantification of human capital, structural capital, and relational capital.

Variable ID	Question ID	Short description of the question	Variable value
HC2	B10Q20	Problems related to employees e.g., low morale, low work intensity, missing or incomplete professional expertise, aversion to change	0.00-0.25-0.50-0.75-1.00 where: 0 – there are problems with everything
		aversion to change	1 – there are no problems
HC3	B10Q21	Forms of training: what percentage of employees participated in in-house or outside training, job rotation	0.00-0.25-0.50-0.75-1.00 where: 0 – there was no training 1 – above 75%
HC4	B10Q26	Incentive schemes, e.g., reward scheme, with the after- action review of the completed job; premium scheme, for predetermined tasks; incentives based on group or overall performance; cafeteria.	0.00-0.25-0.50-0.75-1.00 where: 0 – there is no incentive scheme 1 – 4 or more types of incentive schemes
HC5	B05Q15_11; B05Q15_12	Excellent leadership and highly motivated employees.	0.00-0.25-0.50-0.75-1.00 where: 0 – not different from competitors 1 – completely unique
CS3	B1 <i>5</i> Q08	The leader self-evaluates ten of their entrepreneurial traits on a scale of 1-5	0.00-0.25-0.50-0.75-1.00 where: 0 – the sum of the self-evaluation is 10 points 1 – the sum of the self-evaluation is 47 points and above

Human capital is the normalized value of the average of the following variables:

Appendix 1: The quantification of human capital, structural capital, and relational capital (Continuation).

Structural capital is the normalized value of the average of the following variables:

Variable ID	Question ID	Short description of the question	Variable value
TECH4	B09Q01	Use of ICT assets, e.g., computer, laptop, internet, e-mail, intranet, webpage, web shop, special software (e.g., bookkeeping, CAD, CRM), billing, inventory control software, ERP.	0.00-0.25-0.50-0.75-1.00 where: 0 – the usage of ICT assets is uncommon, or only computer, laptop 1 – the simultaneous use of an ERP system or a solution less pervasive across multiple companies
TECH5	B05Q15_2; B05Q15_3; B05Q15_10	The degree to which the applied technology is advanced and modern, the existence of production control, quality assurance systems, the uniqueness of ICT	0.00-0.25-0.50-0.75-1.00 where: 0 – not different from competitors 1 – completely unique
DEC3	B04Q17	The means of sharing information, e.g., the use of meetings, e-mails, information platforms or applications	0.00-0.25-0.50-0.75-1.00 where: 0 – there is no information sharing or there is only one type 1 – 5 or more types of information sharing
	B04Q16	Consultation during decision-making, the use of advisory agencies when dealing with e.g., involved parties, leaders, owners, employees.	0.00-0.25-0.50-0.75-1.00 where: 0 – there is no consultation during decision-making 1 – wide ranging use of consultation and/or an advisory agency.
DEC5	B04Q11	Operation of the organization, administrative routines, e.g., written organizational structure, clear division of competencies, clarified chain of command, existing job descriptions.	0.00-0.25-0.50-0.75-1.00 where: 0 – the system of operations of the organization and the administrative routines are undefined 1 – the system of operations of the organization and the administrative routines are clearly defined

#### Appendix 1: The quantification of human capital, structural capital, and relational capital (Continuation).

Variable ID	Question ID	Short description of the question	Variable value
NET1	B08Q01; B11Q10	Economic and innovation-based forms of cooperation, e.g., buyer-supplier network, license, consortium, strategic partnership, membership in a professional organization, franchise, cluster, domestic-foreign higher education institution, chamber, technological park, innovation agency	0.00-0.25-0.50-0.75-1.00 where: 0 – not party to any form of cooperation 1 – party to at least on meaningful form of cooperation
NET2	B08Q03	The sum of the duration of the forms of cooperation listed in the previous question	0.00-0.25-0.50-0.75-1.00 where: 0 – not party to any form of cooperation 1 – 15 years or above
NET3	B08Q04	The sum of the intensity (1-5) weighted average (10-50) of the types of external (10 types) help aiding development	0.00-0.25-0.50-0.75-1.00 where: 0 – there was no external help aiding development 1 – the sum of the intensity (1-5) weighted average of the types of external (10 types) help aiding development is 21 or above
NET4	B05Q15_14; B05Q15_15	Stable long-term supplier, buyer relations and unique strategic partners.	0.00-0.25-0.50-0.75-1.00 where: 0 – not different from competitors 1 – completely unique

Relational capital is the normalized value of the average of the following variables:

Appendix 2: The descriptive statistics of intellectual capital (as the sum of components), hun	uman capital, structural capital,	and relational capital.
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	-		-			-	-	-
	Complete sample (n=1,243 SME)				Innovating SMEs (n'=456 SME)			
	Intellectual capital	Human capital	Structural capital	Relational capital	Intellectual capital	Human capital	Structural capital	Relational capital
Mean	1.581	0.536	0.588	0.458	1.842	0.585	0.670	0.586
Median	1.587	0.526	0.600	0.438	1.864	0.579	0.700	0.563
Variance	0.211	0.030	0.037	0.049	0.164	0.034	0.027	0.037
Std. Deviation	0.460	0.174	0.193	0.222	0.404	0.183	0.165	0.192
Minimum	0.328	0.105	0.100	0.000	0.718	0.105	0.150	0.125
Maximum	2.797	1.000	1.000	1.000	2.797	1.000	1.000	1.000
Range	2.469	0.895	0.900	1.000	2.079	0.895	0.850	0.875
Skewness	-0.030	0.178	-0.255	0.098	-0.118	-0.019	-0.515	-0.066
Kurtosis	-0.398	-0.433	-0.571	-0.687	-0.435	-0.468	-0.064	-0.674