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# Determining the Competencies Necessary for Exporting in Furniture Industry with Decision Tree Models

Određivanje izvoznih kompetencija u industriji namještaja uz pomoć modela stabla odlučivanja

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**ABSTRACT** • In order to increase the competitiveness of companies, there are factors that need to be considered both in the domestic and foreign markets. In particular, companies that want to maintain their presence in the foreign market must differentiate from other companies in the industry and gain significant advantages over their competitors in order to maintain this continuity. If companies pay more attention to the factors that are effective in export, they can be predicted to be successful in competition and especially in export. The aim of this study was to determine the factors and issues affecting export performance in furniture industry and to determine the effect of these factors and issues on exports. In this context, the application data were obtained from the survey of 182 managers of companies operating in the furniture industry in Turkey. The scenarios produced in the study were made with J48 algorithm-decision trees modeling, which is one of the data mining methods. Thanks to these scenarios, road maps were drawn to give ideas to the companies and managers planning to export. As a result of this study, the "staff status" factor, the "manager's overseas experience" and "the legal form of the company" were identified as the main determinants of export.

Keywords: export determinants; furniture industry; data mining; decision trees

SAŽETAK • Kako bi se povećala konkurentnost tvrtke, potrebno je uzeti u obzir čimbenike koji utječu na domaće i inozemno tržište. Tvrtke koje žele biti kontinuirano zastupljene na inozemnom tržištu moraju se izdvajati od ostalih tvrtki i imati znatne prednosti pred konkurentskim tvrtkama. Ako tvrtke više pozornosti pridaju čimbenicima koji utječu na izvoz, može se očekivati da će biti konkurentne u izvozu svojih proizvoda. Cilj ovog istraživanja bio je utvrditi čimbenike i probleme koji u industriji namještaja utječu na izvoz i procijeniti njihov utjecaj na izvoznu uspješnost. U tu su svrhu anketirana 182 voditelja tvrtki za proizvodnju namještaja koje posluju u Turskoj. Scenariji prikazani u ovom istraživanju načinjeni su uz pomoću algoritma J48 – modela stabla odlučivanja, što je jedna od metoda rudarenja podataka. Zahvaljujući tim scenarijima, izrađeni su hodogrami koji mogu pomoći tvrtkama i voditeljima u planiranju izvoza. Rezultati ovog istraživanja pokazali su da su glavne odrednice izvoza status osoblja, inozemno iskustvo voditelja tvrtke i pravni oblik tvrtke.

Ključne riječi: odrednice izvoza; industrija namještaja; rudarenje podataka; stablo odlučivanja

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#### **1 INTRODUCTION**

#### 1. UVOD

Furniture industry is an important foreign trade area in the world. The furniture industry is an important economic factor in the world with its rapidly increasing growth and an annual value of approximately 437 billion dollars. In the furniture industry, which was once dominated by European countries, China has been the leading world industry with a 35 % share in recent years. Although Asia and the Pacific continue to be the fastest growing regions, it is noteworthy that in 2016 China's exports in furniture decreased, while Vietnam became the fastest growing furniture industry. In the last 5 years, the increase in furniture imports in the USA increased from 23 billion dollars to 32 billion dollars and became the main source of growth in this industry (TRADEMAP, 2019). Figure 1 presents the leading exporters in the furniture industry in the world.

In terms of exports, being successful in world trade is possible by following a competitive policy at a global level. In this case, it is possible to measure the foreign trade ability of a country and an industry by determining the factors affecting the export performance.

It has been observed that scientific studies related to export performance are mostly conducted in nonfurniture industries. In the scientific studies related to the furniture industry, subjects other than export performance have been addressed. In this context, this study is original.

The motivations of this paper can be listed as follows: (1) no academic studies observed the determinants of exporting performance of companies on the world furniture market, which is fast growing based on decision tree approach; (2) almost no assumptions are needed in decision tree modelling such as in regression models; (3) the question whether there are any different determinants in furniture export industry with respect to other industries and other countries. Accordingly, researching these items can be considered as highlights of the study. In the literature on export performance, the following models were widely used: Export Performance and Determinant Model (Aaby and Slater, 1989), Export Performance Model (Dhanaraj and Beamish, 2003), Determining Models of Export Performance (Madsen, 1989), Theoretical Model (Gemunden, 1991) and Export Performance Model (Zou and Stan, 1998). In addition, in many studies, it can be found that the factors affecting export performance are divided into two groups, both internal and external factors, and economic and non-economic factors.

When the literature is examined in detail, it can be observed that many researchers divide the variables used into internal and external variables. Internal variables used in scientific studies are divided into titles as management characteristics and perceptions, organizational capabilities, knowledge-based factors, relational factors and company characteristics. The variables under these main headings and the researchers using these variables are given in Table 1.

The external variables used in the measurement of export performance in the literature are given under two main headings: domestic market characteristics and characteristics of export market. The external variables used under these main headings are given in Table 2.

On the other hand, many scientists working on export performance categorized the factors that are effective in performance measurement in two sub-headings as economic factors and non-economic factors. The factors that are economic are related to sales and market relations (Table 3).

Non-economic factors are evaluated under two headings as "General" and "Other". These factors and the studies using these factors are given in Table 4.

#### 2 MATERIALS AND METHODS 2. MATERIJALI I METODE

In the questionnaire prepared to be used in the analysis of the study, opinions about the characteris-

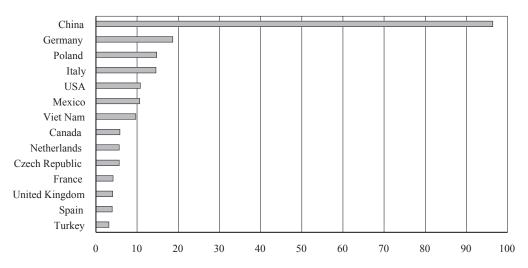


Figure 1 Exports in wood furniture of major countries in world furniture exports in 2018, in billion \$ (TRADEMAP, 2019) Slika 1. Izvoz drvenog namještaja vodećih zemalja u izvozu namještaja u svijetu u 2018. (u mlrd. USD) (TRADEMAP, 2019.)

Table 1 Internal variables used in measurement of export performance
Tablica 1. Unutarnje varijable upotrijebljene u procjeni odrednica izvoza

Internal variables / Unutarnje varijable	References / Literatura
Management features and perceptions / Značajke i	Reid, 1983; Çavuşgil, 1984; Aaby and Slater, 1989; Rocha et al.,
percepcije upravljanja	1990; Dichtl, Koeglmayr and Müller, 1990; Holzmüller and Stöt-
percepenje uprarija	tinger, 1996; Czinkota and Ursic, 1991; Oviatt and McDougall,
Export commitment and support / izvozna predanost i	1994; Çavuşgil and Zou, 1994; Roth, 1995; White <i>et al.</i> , 1998; Zou
potpora	and Stan, 1998; Beamish et al., 1999; Jones, 2001; Styles and Am-
International experience / međunarodno iskustvo	bler, 2000; Dean et al., 2000; Katsikeas et al., 2006; Stöttinger and
International orientation / međunarodna orijentacija	Holzmüller, 2001; Gençtürk and Kotabe, 2001; Ibeh and Young,
Export motivation / motivacija za izvoz	2001; O'Cass and Julian, 2003; Ibeh, 2003; Alvarez, 2002; Con-
Perception of export advantages / percepcija prednosti	tractor et al., 2003; Lages and Montgomery, 2004; Ibeh and Wheel-
izvoza	er, 2005; Brouthers and Nakos, 2005; Cadogan et al., 2005; Lejpras,
Age, Education / dob, obrazovanje	2019
Organization capabilities / Mogućnosti organizacije	Madsen 1989; Çavuşgil et al., 1993; Chetty and Hamilton, 1993; Styles and Ambler, 1994; Thirkell and Dau, 1998; Piercy et al.,
Advanced technology / napredna tehnologija	1998; Robertson and Chetty, 2000; Prasad et al., 2001; Shoham et
Product - service quality / kvaliteta proizvoda/usluge	<i>al.</i> , 2002; Balabanis and Katsikea, 2003; O'Cass and Julian, 2003; Yeoh, 2004; Alvarez, 2004; Contractor <i>et al.</i> , 2003; Haahti <i>et al.</i> , 2005; Lopez-Rodriguez and Rodriguez, 2005; Lejpras, 2019
Export strategy / strategija izvoza	White <i>et al.</i> , 1998; Hoang, 1998; Zou and Stan, 1998; Piercy <i>et al.</i> ,
Export planning / <i>planiranje izvoza</i>	1998; Aaby and Slater, 1989; Shoham, 1999a; Robertson and Chet-
Export organization / organizacija izvoza	ty, 2000; Baldauf <i>et al.</i> , 2000; Dean <i>et al.</i> , 2000; Francis and Col-
Market expansion / š <i>irenje tržišta</i>	lins-Dodd, 2004; Li and Ogunmokun, 2001; Shoham <i>et al.</i> , 2002;
Service strategy / strategija usluge	Solberg, 2002; Balabanis and Katsikea, 2003; Deng et al., 2002;
Risk taking, Control, Process / preuzimanje rizika,	Dhanaraj and Beamish, 2003; Julien and Ramangalahy, 2008;
kontrola, postupak	Chung, 2003; Chen et al., 2004; Li, 2004; Haahti et al., 2005; Ibeh
	and Wheeler, 2005; Brouthers and Nakos, 2005; Contractor et al.,
	2003
Marketing Mix / marketinški miks	Amine and Çavuşgil, 1986; Madsen, 1989; Fraser and Hite, 1990;
Product strategy / strategija proizvoda	Louter et al., 1991; Dominguez and Sequeira, 1993; Beamish et al.,
Price strategy / strategija cijena	1993; Styles and Ambler, 1994; Çavuşgil and Zou, 1994; Thirkell
Promotional strategy / promidžbena strategija	and Dau, 1998; Piercy et al., 1998; Hoang, 1998; Samiee and An-
Distribution strategy / strategija distribucije	ckar, 1998; Shoham, 1999b; Myers, 1999; Robertson and Chetty,
	2000; Gençtürk and Kotabe, 2001; Albaum and Tse, 2001; Li and
	Ogunmokun, 2001; Brouthers and Xu, 2002; Shoham <i>et al.</i> , 2002; Chung, 2003; O'Case and Julian, 2002; Marson et al., 2004; Lee
	Chung, 2003; O'Cass and Julian, 2003; Morgan <i>et al.</i> , 2004; Lee and Griffith, 2004; Chen <i>et al.</i> , 2004; Lages and Montgomery,
	2004; Brouthers and Nakos, 2005
Knowledge-based factors / Čimbenici utemeljeni na	Hoang, 1998; Baldauf <i>et al.</i> , 2000; Dean <i>et al.</i> , 2000; Francis and
znanju	Collins-Dodd, 2004; Li, 2004; Li and Ogunmokun, 2001; Prasad <i>et</i>
znanju	<i>al.</i> , 2001; Brouthers and Xu, 2002; Solberg, 2002; Deng <i>et al.</i> ,
Export expertise / izvozna ekspertiza	2002; O'Cass and Julian, 2003; Chen <i>et al.</i> , 2004; Contractor <i>et al.</i> ,
International experience / međunarodno iskustvo	2003; Brouthers and Nakos, 2005; Lejpras, 2019
Export information, Market research, Customer	Kogut and Zander, 1992; Grant, 1996; Teece <i>et al.</i> , 1997; Hart and
information, Market information, Competitor informa-	Tzokas, 1999; Yeoh, 2004; Richey and Myers, 2001; Solberg, 2002;
tion, Supply chain channel information	Morgan <i>et al.</i> , 2003; Li, 2004
informacije o izvozu, istraživanje tržišta; podatci o	,, ,
kupcima; podatci o tržištu; podatci o konkurentima;	
podatci o kanalu lanca opskrbe	
Relational factors / Relacijski čimbenici	Coviello and Munro, 1997; Zou and Stan, 1998; Styles and Ambler,
~	2000; Crick and Jones, 2000; Li and Ogunmokun, 2001; Cadogan
Business and corporate relations, Distribution channel	et al., 2005; Ibeh and Wheeler, 2005; Styles et al., 2008
relationship, Customer relationship, Supplier relation-	
ship, Partnership relationship, Membership in regis-	
tered and unregistered commercial networks, Govern-	
ment and other corporate relations	
ment and other corporate relations poslovni i korporativni odnosi; odnos distribucijskih	
poslovni i korporativni odnosi; odnos distribucijskih kanala; odnos s kupcima; odnos s dobavljačima;	
poslovni i korporativni odnosi; odnos distribucijskih kanala; odnos s kupcima; odnos s dobavljačima; partnerski odnos; članstvo u registriranim i neregis-	
poslovni i korporativni odnosi; odnos distribucijskih kanala; odnos s kupcima; odnos s dobavljačima;	

**Table 1** Internal variables used in measurement of export performance (continuation)**Tablica 1.** Unutarnje varijable upotrijebljene u procjeni odrednica izvoza (nastavak)

Internal variables / Unutarnje varijable	References / Literatura
Company characteristics / Obilježja tvrtke	Çulpan, 1989; Beamish et al. 1993; Hoang, 1998; Thirkell and Dau,
	1998; White et al., 1998; Piercy et al., 1998; Andersen and Moen,
Company size / veličina tvrtke	1999; Myers, 1999; Beamish et al., 1999; Shoham, 1999a; Shoham,
Degree of internationalization / stupanj internacionali-	1999b; Baldauf et al., 2000; Robertson and Chetty, 2000; Styles and
zacije	Ambler, 2000; Dean et al., 2000; Wolff and Pett, 2000; Francis and
Company age / starost tvrtke	Collins-Dodd, 2004; Gençtürk and Kotabe, 2001; Stöttinger and
Industry sector - product type / industrijski sektor -	Holzmüller, 2001; Richey and Myers, 2001; Albaum and Tse, 2001;
vrsta proizvoda	Li and Ogunmokun, 2001; Brouthers and Xu, 2002; Solberg, 2002;
Organization culture / kultura organizacije	O'Cass and Julian, 2003; Prasad et al., 2001; Rose and Shoham,
Financial resources / financijska sredstva	2002; Shoham et al., 2002; Cadogan et al., 2005; Akyol and Ake-
Ownership structure / vlasnička struktura	hurst, 2003; Balabanis and Katsikea, 2003; Deng et al., 2002;
	Chung, 2003; Dhanaraj and Beamish, 2003; Julien and Raman-
	galahy, 2008; Morgan et al., 2004; Alvarez, 2004; Li, 2004; Chen et
	al., 2004; Francis and Collins-Dodd, 2004; Lee and Griffith, 2004;
	Yeoh, 2004; Haahti et al., 2005; Cadogan et al., 2005; Brouthers and
	Nakos, 2005; Contractor et al., 2007; Bekteshi, 2020

**Table 2** External variables used in measurement of export performance**Tablica 2.** Vanjske varijable primijenjene za mjerenje obilježja izvoza

External variables / Vanjske varijable	References / Reference
Characteristics of export market / Obilježja izvoznog	White et al., 1998; Baldauf et al., 2000; Dean et al., 2000;
tržišta	Robertson and Chetty, 2000; Brouthers and Xu, 2002; Rose and
	Shoham, 2002; O'Cass and Julian, 2003; Balabanis and Katsikea,
Legal and political, Cultural similarity	2003; Chen et al., 2004; Lee and Griffith, 2004; Morgan et al.,
Market competitiveness, Environmental competitive-	2004; Cadogan et al., 2005; Lages and Montgomery, 2004
ness, Economic similarity, Channel accessibility	
Customer exposure	
zakoni i politika; sličnost kultura; tržišna konkurent-	
nost; okolišna konkurentnost; gospodarska sličnost;	
dostupnost kanala; izloženost kupaca	
<b>Domestic market features</b> / Obilježja domaćeg tržišta	Robertson and Chetty, 2000; Gençtürk and Kotabe, 2001;
	Stöttinger and Holzmüller, 2001; Francis and Collins-Dodd, 2004;
Domestic market conditions, Export support/	Alvarez, 2002; Lages and Montgomery, 2004
uvjeti na domaćem tržištu; potpora izvozu	

 Table 3 Economic factors used in measurement of export performance

 Tablica 3. Ekonomski čimbenici primijenjeni u procjeni obilježja izvoza

References / Literatura
Czinkota and Ronkainen, 1995; Çavuşgil, 1984; Cooper and Klein-
schmidt, 1985; Reid, 1983; Schlegelmilch and Ross, 1987; Çulpan,
1989; Madsen, 1989; Walters and Samiee 1990; Axinn and Thach
1990; Louter et al., 1991; Czinkota and Ursic, 1991; Chan, 1992; Ito
and Pucik, 1993; Walters, 1993; Kaynak and Kuan, 1993; Beamish
et al., 1993; Bodur, 1994; Crick and Jones, 2000; Akyol and Ake-
hurst 2003; Lim, Sharkey and Kim, 1996; Katsikeas et al., 2000;
Thirkell and Dau, 1998; Hoang, 1998; Wakelin, 1998; Piercy et al.,
1998; Styles et al., 2008; White et al., 1998; Shoham, 1999a; Hart
and Tzokas, 1999; Shoham 1999b; Myers, 1999; Beamish et al.,
1999; Andersen and Moen, 1999; Dean et al., 2000; Wolff and Pett,
2000; Francis and Collins-Dodd, 2004; Baldauf et al., 2000; Stew-
art and McAuley, 2000; Yeoh, 2004; Styles and Ambler, 2000; Rob-
ertson and Chetty, 2000; Gençtürk and Kotabe, 2001; Richey and
Myers, 2001; Stöttinger and Holzmüller, 2001; Li and Ogunmokun,
2001; Prasad et al., 2001; Brouthers and Xu, 2002; Shoham et.al.,
2002; Patterson, Cicic and Shoham, 1997; Rose and Shoham, 2002;
Solberg, 2002; Roper and Love, 2002; Cadogan et al., 2005;
Dhanaraj and Beamish, 2003; Balabanis and Katsikea 2003; Lages
and Montgomery, 2004; Morgan et al., 2004.

 Table 3 Economic factors used in measurement of export performance (continuation)

 Tablica 3. Ekonomski čimbenici primijenjeni u procjeni obilježja izvoza (nastavak)

Market related / Vezani za tržište	Çavuşgil and Zou, 1994; Thirkell and Dau, 1998; White et al.,
Export market share / udio u izvoznom tržištu	1998; Piercy et al., 1998; Shoham, 1999a; Andersen and Moen,
Export market share by competitors / udio konkurenata	1999; Myers, 1999; Robertson and Chetty, 2000; Albaum and Tse,
u izvoznom tržištu	2001; Richey and Myers, 2001; Prasad et al., 2001; Baldauf et al.,
Export market share growth / rast udjela na izvoznom	2000; Brouthers and Xu, 2002; Cadogan et al., 2005; Rose and
tržištu	Shoham, 2002; Solberg, 2002; Dhanaraj and Beamish, 2003; Akyol
Export market share growth compared to competitors,	and Akehurst, 2003; Lages and Montgomery, 2004; Morgan et al.,
Market solidarity	2004.
Market diversification, Entry rate to new markets,	
Entry rate to new markets compared to competitors	
rast udjela izvoznog tržišta u usporedbi s konkuren-	
tima; tržišna solidarnost; diversifikacija tržišta; stopa	
ulaska na nova tržišta; stopa ulaska na nova tržišta u	
usporedbi s konkurentima	

 Table 4 Non-economic factors used in measurement of export performance

 Tablica 4. Neekonomski čimbenici primijenjeni za mjerenje obilježja izvoza

Non-economic factors / Neekonomski čimbenici	References / Literatura
General / Općenito	Seifert and Ford, 1989; Raven, McCullogh and Tansu-
	haj, 1994; Singer and Czinkota 1994; Katsikeas et al.,
Export success / uspjeh izvoza	1996; Patterson, Cicic and Shoham, 1997; Styles et al.,
Rating of export performance compared to competitors / ocjena	2008; White et al., 1998; Thirkell and Dau, 1998; An-
provedbe izvoza u usporedbi s konkurentima	derson and McAuley, 1999; Andersen and Moen, 1999;
Overall export performance / ukupni izvozni učinak	Myers, 1999; Styles and Ambler, 2000; Robertson and
Overall export performance compared to competitors / ukupni	Chetty, 2000; Stewart and McAuley, 2000; Crick and
izvozni učinak u usporedbi s konkurentima	Jones, 2000; Gençtürk and Kotabe, 2001; Li and
Strategic export performance / strateška provedba izvoza	Ogunmokun, 2001; Prasad et al., 2001; Shoham et al.,
	2002; Solberg, 2002; Brouthers and Xu, 2002; O'Cass
	and Julian, 2003; Akyol and Akehurst, 2003; Balabanis
	and Katsikea, 2003; Lages and Montgomery, 2004;
	Manzanares, 2019; Imran et al. 2020
Others / Drugi čimbenici	Thirkell and Dau, 1998; Myers, 1999; Prasad et al.,
	2001; Gençtürk and Kotabe, 2001; Morgan et al., 2004;
Achieving targets related to reaction to competition pressure,	Manzanares, 2019; Imran et al. 2020
Awareness and image creation in export market,	
Contribution of export to the growth of the company and the	
contribution of the management quality of the company	
Customer satisfaction, New technology - expertise, Product-service	
quality	
Quality of customer relations, Quality of distributor relations,	
Reputation of the company	
postizanje ciljeva vezanih za reakciju na pritisak konkurencije;	
svjesnost i stvaranje dojma na izvoznom tržištu; doprinos izvoza	
rastu poduzeća i doprinos kvalitete upravljanja; zadovoljstvo	
kupaca; nova tehnologija/stručnost; kvaliteta proizvoda/usluga;	
kvaliteta odnosa s kupcima; kvaliteta odnosa s distributerima;	
ugled tvrtke	

tics, attitudes, and strategies of the companies were collected by a total of 95 questions, 51 items of which are in 7 points likert scale, and 32 of which consist of mostly open-ended, ratio scale and some nominal scale questions on the characteristics of companies.

The 1-7 interval scale is used, 1 referring to "strongly disagree", 4 referring to "not agree/disagree", and 7 referring to "strongly agree".

As the random process was not used in sampling, the evaluations obtained from the analysis represent the properties and attitudes of 182 companies. Based on the literature research, it was decided to examine all the influential variables in determining the exporting of the furniture industry; accordingly the attitudes/trends of the companies in terms of 51 items and eight factors listed below were measured, in order to determine the effective items/factors in exporting (Table 5).

The listed items, evaluated in the following tables are selected according to conducted factor analyses for each dimension, separately. The scores of 51 items selected out of 63 items are the arithmetic means of the item attitude scores attributed by companies, and **Table 5** List of variables used in the study**Tablica 5.** Popis varijabli primijenjenih u istraživanju

Tablica 5. Popis varijabil primijenjenin u istrazivanju	
1. Factor: Brand-advertisement-packaging	5. Factor: Environmental and economic
1. čimbenik: brend/reklama/pakiranje	5. čimbenik: okoliš i gospodarstvo
The importance of internet sites in promotion / važnost internetskih	Internal market shrinkage / smanjenje unutarnjeg
stranica u promociji	tržišta
Congress fair participation / sudjelovanje na kongresima	Export to EU countries / <i>izvoz u zemlje EU-a</i>
Promotion of new product in short time / promocija novog	Distance to market / udaljenost od tržišta
proizvoda u kratkom vremenu	Cultural similarity with market / kulturološka
Advertisement promotion activities / promotivne aktivnosti putem	sličnost s tržištem
oglašavanja Giving importance to packaging / pridavanje važnosti pakiranju	Attention to demographic characteristics / briga o demografskim obilježjima
Being a brand of every product / <i>težnja da svaki proizvod bude</i>	Change in exchange rates / promjena tečaja
brend	Effect of interest rates / <i>učinak kamatnih stopa</i>
Being a recognized brand / biti priznati brend	Effect of interest fates / activat kumuliun stopa
Not having a marketing problem / <i>nema marketinških problema</i>	
2. Factor: Customer satisfaction	6. Factor: Management style and format
2. čimbenik: zadovoljstvo kupaca	6. čimbenik: način i format upravljanja
	Compliance with export / usklađenost s izvozom
Complaint for product / prigovor na proizvod On-time delivery / pravodobna dostava	Desire and support for exporting / <i>želja za</i>
Compliance with technical requirements / sukladnost s tehničkim	izvozom i potpora izvozu
zahtjevima	Appreciating export opportunities / <i>poštovanje</i>
Customer expectation in new product / <i>očekivanja kupaca vezana</i>	izvoznih mogućnosti
za novi proizvod	Having export motivation / <i>postojanje motivacije</i>
Quality based satisfaction / <i>zadovoljstvo kvalitetom</i>	za izvoz
Price based satisfaction / zadovoljstvo cijenom	
Design based satisfaction / zadovoljstvo dizajnom	
Technical team for customer satisfaction / <i>tehnički tim zadužen za</i>	
zadovoljstvo kupaca	
Satisfying warranty period / zadovoljavajući jamstveni rok	
3. Factor: Competition status	7. Factor: Research and development activities
3. čimbenik: status konkurencije	7. čimbenik: istraživačke i razvojne aktivnosti
Fast adaptation to demand / brza prilagodba potražnji	Pioneer in new product / pionirska uloga u
Not worrying about the new competition / suvišnost brige o novoj	razvoju novih proizvoda
konkurenciji	Eco-friendly / ekološka prihvatljivost
Determination of sales price by competitors / određivanje prodajne	Innovative in ARGE / inovativnost u ARGE-u
cijene ovisno o konkurenciji	Having detailed information about the market /
Taking the quality document easily / jednostavno preuzimanje	posjedovanje detaljnih informacija o tržištu
dokumenata o kvaliteti	Following technology / praćenje tehnologije
New market research being pioneer in price determination / novo	
istraživanje tržišta kao pionirski korak u određivanju cijena	
Ensuring price advantage / osiguranje cjenovne prednosti	
Possessing competitive power in the industry / posjedovanje	
konkurentske moći u industriji	
Developing different strategies for different products / <i>razvijanje</i>	
različitih strategija za različite proizvode	
4. Factor: Export structure	8. Factor: Personnel status
4. čimbenik: struktura izvoza	8. čimbenik: status osoblja
Pioneering in exporting / pionirski izvoz	In-service training / stručno usavršavanje
Having an export strategy / <i>posjedovanje izvozne strategije</i>	Provision of qualified personnel / osiguranje
Having an export organization / <i>postojanje organizacije izvoza</i>	kvalificiranog osoblja
Receiving professional support in the export strategy / <i>primanje</i>	Employee ambience satisfaction / <i>zadovoljstvo</i>
stručne potpore u izvoznoj strategiji	korisnika sredinom
Export agreement period / razdoblje ugovora o izvozu	
Making export in the last 5 years / <i>izvoz u posljednjih pet godina</i>	

factor scores of these eight factors are the means of the item scores of the factor members.

The variables obtained from 32 open-ended questions are:

- Equity (\$)
- Management Type (Individual/Family Company, Corporate Company)
- Advertising Expenditure (\$)
- Manager's Experience Abroad (year)

- Legal Form of the Company (Ordinary, Joint Stock or Limited Liability, Limited Partnership, Collective)
- Automation Utilization Rate (%)

Scenarios were produced with the help of algorithms called J48 and decision trees were formed with the variables that were more effective in these scenarios. All of the analyses were done with the software called WEKA. WEKA is a Data Mining application development program that started as a project and today it is used by many people around the world. WEKA is an open code program developed on the Java platform.

#### 2.1 Decision trees and pruning

#### 2.1. Stabla odlučivanja i obrezivanje

Decision trees are an important machine learning algorithm used in many areas. The J48 algorithm is a decision tree classification algorithm. Decision trees are widely used because they are easy to evaluate and perceive, and they do not need to satisfy as much assumptions as the regression models. The J48 algorithm consists of two steps. The first is the process of forming the structure of the tree and the second is pruning (Gümüşçü *et al.*, 2016). In this study, J48 classification algorithm developed by J. Ross Quinlan was used.

Decision trees consist of a root, nodes, branches and leaves. The top part of the tree is called root and the bottom part is called leaf. Each attribute in the data set represents the nodes. The parts that provide the connection between the nodes are called branches.

The most important process step in forming decision trees is to decide which branching will take place according to quality value (Kavzaoğlu and Çölkesen, 2010). Knowledge gain (Equation 1), gini index (Equation 2) and towing rule (Eq. 3) are commonly used as decision-making criteria (Gümüşçü *et al.*, 2016).

Assuming that if the number of classes is h and these class values are repeated as T, then the probability value of a class is as in Eq. 1.

$$P_{i} = \frac{C_{i}}{|T|} \tag{1}$$

 $C_i$  represents the number of class values in a class. If the entropy value of this class is H(T), it is as in Eq. 2.

$$H(T) = -\sum_{i=1}^{n} P_i \log_2 P_i$$
(2)

Considering that T class values are subdivided into  $T_1, T_2, ..., T_n$  according to Y attribute values in the data set, the information gain that can be obtained by dividing the T class values by using Y attribute values is as in Eq. 3.

$$IG(Y,T) = H(T) - \sum_{i=1}^{n} \frac{|T_i|}{|T|} H(T_i)$$
(3)

In calculating the value of the attribute, the dissociation information is calculated as in Eq. 4.

$$SI(Y) = -\sum_{i=1}^{n} \frac{|T_i|}{|T|} \log_2\left(\frac{|T_i|}{T}\right)$$
(4)

The amount of information gain is obtained by the ratio of the information gain to the dissociation information (Equation 4). In this way, the tree structure is created according to the quality with the highest earnings information by finding earnings information for each attribute (Gümüşçü *et al.*, 2016).

In addition to obtaining the structure of decision trees, pruning is another important process. Pruning can be done in two ways. When the tree structure is obtained, the process of stopping the division to prevent the tree to grow further is called pre-pruning. As another method, after the tree structure is completely formed, the nodes considered to be excessive are removed. This pruning process is known as the last pruning (Quinlan, 1999).

## 2.2 Evaluation of classification result

#### 2.2. Evaluacija rezultata klasifikacije

To measure the success of the classification, it is not enough to look at the accuracy rate. The recall and precision values of the classification process also provide information about the success of the classification.

Accuracy Ratio: The ratio of the number of correctly classified samples to the total number of samples.

$$Accuracy = \frac{TP + TN}{Total Sample Count}$$
(5)

TP (True positive): It means that it does export for export company.

FP (False positive): It means that it does export for non-exporting company.

TN (True negative): It means that it does not export to the non-exporting company.

FN (False negative): It means that it does not export to the exporting company.

In this case, the confusion matrix is formed as follows (Table 6):

Recall: The rate of correct detection of non-export.

$$Recall = \frac{TP}{TP + FN} \tag{6}$$

Precision: The ratio of those who cannot actually export and those who cannot export.

$$Precision = \frac{TP}{TP + NP}$$
(7)

There is a conflict between the two important scales. To eliminate this, the F score is measured. The F score uses the harmonic mean to be able to ignore extreme values.

$$F_{\text{Score}} = 2 \times \frac{Precision \times Recall}{Precision + Recall}$$
(8)

Actual / Stvaran Positive / Pozitivan Negative / Negativan False negative Positive True positive stvarno pozitivan lažno negativan pozitivan Prediction False negative True negative Negative predviđanje lažno negativan stvarno negativan negativan

**Table 6** Confusion matrix**Tablica 6.** Matrica konfuzije

#### 2.3 ROC curve (Receiver Operating Characteristic Curve)

 ROC krivulja (karakteristična krivulja rada prijamnika)

ROC Curve is used frequently in the success calculations of classification models. It is basically calculated over two values.

TPR (True Positive Ratio): It means the sensitivity ratio in detecting exporting companies.

$$TPR = \frac{TP}{TP + FN} \tag{9}$$

FPR (False Positive Ratio): It is the rate of determining that means "it does export" to non-exporting companies.

$$FPR = \frac{FP}{FP + FN} \tag{10}$$

When these two values are placed on the x and y axes, the area under the line (AUC) is calculated and the TPR and FPR ratios are determined against the limit values falling along the curve. For each limit value, precision and recall values are calculated and the limits that make the F score maximum are selected. In fact, the larger the area below the line, the higher the success rate of the model. The higher the *F* score, the higher is the area under the line (Sik, 2014; Aydemir, 2017, Langloisa and Frank; 2011).

Sensitivity (Recall or True positive rate): Sensitivity is calculated as the number of correct positive predictions divided by the total number of positives. It is also called recall (REC) or true positive rate (TPR). The best sensitivity is 1.0, whereas the worst is 0.0. Sensitivity is calculated as the number of correct positive predictions (TP) divided by the total number of positives (P = TP + FN) (Langloisa and Frank; 2011).

Kappa statistic: Kappa statistic is called the accuracy measure of the prediction. Kappa takes a value between 0 and 1. If kappa is between 0.4 and 0.6, a moderate fit is achieved. If the Kappa value is between 0.6 and 0.8, it means that there is a good level of prediction. A very good level of harmony is achieved between Kappa 0.8 and 1 (Landis and Koch, 1977).

## 3 RESULTS

## 3. REZULTATI

The variables used in this section have been determined through the regression and logistic regression analyses, which are more effective in exporting, taking into account the findings obtained above. In order to create healthy models in the scenarios, these preliminary analyses were performed in order to find the variables that might have the ability of representation in the model. These variables are modeled with decision trees on the basis of WEKA with different scenarios.

# **3.1** Scenario 1 and findings 3.1. Scenarij 1. i zaključci

The first model included variables such as Shareholders' Equity, Management Type, Legal Form of the Company, Sales Revenues, Partnership Status, Percentage of Automation Usage, Advertising Expenditures, Product Development Expenditures. In order to reach a more accurate result, surveys that did not include the Equity and Advertising Expenditures data were excluded from the evaluation. In this case, a total of 68 companies were evaluated. As a result of J48 algorithm, the number of correctly classified data is 66 and the number of incorrectly classified data is 2. The model is classified with an accuracy of 97.1 %.

As a result of the evaluation of J48 decision tree algorithm, it was seen that the variables of Equity, Management Type and Advertising Expenditures, which were initially included in the model, had more meaningful explanations. Since the equity variable has the highest entropy, the decision tree started branching with this variable. It was concluded that furniture companies with equity higher than \$77,000 can export.

According to Figure 2, the second-high entropy Management Type variable leads the decision tree for companies whose equity capital is below \$ 77,000. According to this variable, the management style of the companies shows that they can export even if their equity is below \$ 77,000. However, for companies managed as Family Business, the Advertising spending variable is the final decision maker of the decision tree. Accordingly, it is seen that the companies that are family companies and that allocate more than \$ 10,000 for Advertising Expenditures can export. Finally, it was concluded that the companies that allocate \$ 10,000 or less budget for advertising expenditures cannot export.

In this Scenario, the following conditions are necessary for a company to export;

- 1. If the equity is more than \$ 77,000,
- 2. Although the equity is less than \$ 77,000, if the firm is managed as a corporate company,
- 3. If it is a family owned company with an equity capital of less than \$ 77,000, it can export if it allocates more than \$ 10,000 to the advertising expenditure.

In the decision tree model obtained by using J48 algorithm in WEKA program, the number of leaves was 4 and the length of the tree was 7. It was found that the variables included in the model accounted for 97 % of the structure of the decision tree. This result shows that the model is descriptive. When talking about the success of a model, it was only mentioned in the method part of this paper that the accuracy rate alone would not make sense. Accuracy value and recall value were found to be 0.971. The ROC area value was calculated as 0.907 and the F score was 0.971, so the model was very successful. The accuracy measure of the prediction, kappa statistic, was found to be 0.817 and proved that the prediction showed a very good level of fit.

#### 3.2 Scenario 2 and findings

#### 3.2. Scenarij 2. i zaključci

In Scenario 2 established with WEKA, all the factors, the manager's experience abroad and the legal form of the company were used as input. The Export Structure Factor was the first node of the decision tree.

According to this scenario, it is seen that no company without a score for the Export Structure factor

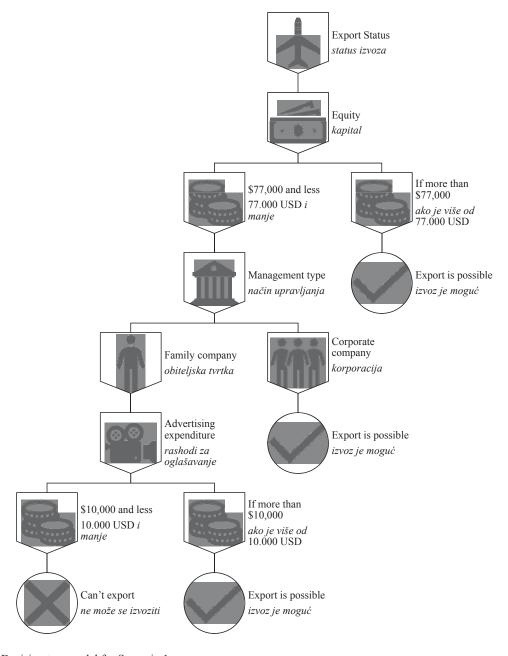


Figure 2 Decision tree model for Scenario 1 Slika 2. Model stabla odlučivanja za 1. scenarij

can export (Figure 3). This factor in the decision tree should not be taken into account in the comments, as this Export Structure factor is only taken into account in exporting companies. Since this Scenario included the manager's experience abroad at a critical level of 4 years, the interpretation of the scenario was considered original. If the Export Structure factor is higher than zero, the overseas experience of the Manager plays an important role in the decision tree. Accordingly, if the manager has overseas experience for more than 4 years, it can be said that this company exports easily. If it is a company with a manager who has less than 4 years of experience abroad, it can export only if it is a Joint Stock Company or a Limited Company.

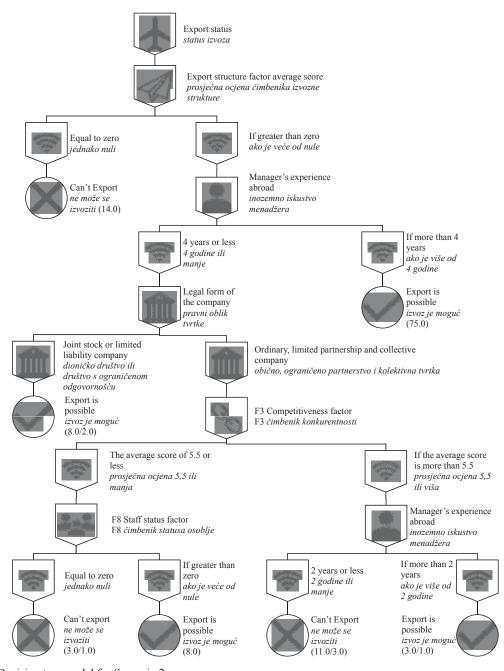
If the firm is a common, limited partnership or a collective company, the Competitiveness factor appears to be prominent. Accordingly, if the Competitive Status factor score is above 5.5, the fact that the com-

pany manager has more than 2 years of experience means that the company can export. However, if the manager has 2 years or less experience abroad, this company cannot export.

If the Company's Competitiveness factor has a value of 5.5 or less, the Staff Situation factor comes into play. It is not possible for a company whose personnel situation score is zero to export. It is determined that if the value of Personnel Situation factor is higher than 0 and if the Competitive Status factor is less than 5.5, this company can export.

In this scenario, the following conditions are necessary for a company to export;

- 1. If the Export Structure factor score is greater than zero and the manager's overseas experience is more than 4 years,
- 2. If the Export Structure factor is greater than zero and the manager's overseas experience is 4 years or less,



**Figure 3** Decision tree model for Scenario 2 **Slika 3.** Model stabla odlučivanja za 2. scenarij

provided the legal form of the firm is limited or joint-stock company,

- 3. If the Export Structure factor is greater than zero, the manager's overseas experience is less than 4 years and the Competition Status score is less than 5.5, and the Staff Situation score is greater than zero,
- 4. If the Export Structure factor is greater than zero, the manager's overseas experience is less than 4 years and the Competition Status score is more than 5.5 and if the manager's overseas experience is between 2 and 4 years.

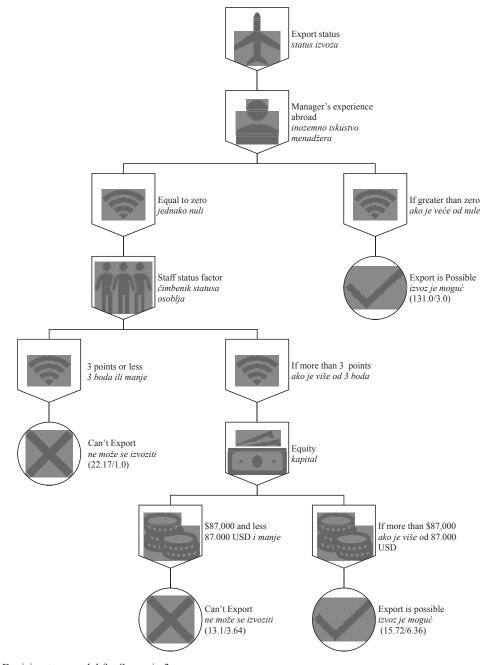
The accuracy of the scenario was found to be 94.5 %. This means that only 10 out of 182 companies were misclassified. Accuracy value was calculated as 0.945 and recall value was calculated as 0.945. The ROC Area value was 0.968 and the F score was 0.945. These values mean that the model is quite successful.

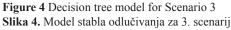
The accuracy measure of the prediction, kappa statistic, was found to be 0.836 and proved that the prediction showed a very good level of fit.

#### 3.3 Scenario 3 and findings

#### 3.3. Scenarij 3. i zaključci

The variables used in Scenario 3 were Competitiveness, Export Structure, Personnel Situation, Manager's overseas experience, logarithm of this variable, Equity, Legal Structure of the Company, Automation Utilization Rate and Advertising Expenditures. According to these variables, for the scenario in Figure 4, the experience of the manager abroad is the most important factor for a company to export. If the manager has any overseas experience, even for a very short time, it means that the company he works for can easily export (131 companies). However, if the





manager has no experience abroad, the most important factor in the decision tree is the staff situation. Accordingly, it is concluded that companies whose average score is 3 or less cannot export. However, it is possible to decide whether the companies whose Staff Situation factor is higher than 3 can export by looking at the third important issue, equity. Accordingly, it was concluded that companies with an equity capital of \$ 87,000 and below could not export and companies with an equity of \$ 87,000 or more could export.

In this Scenario, the following conditions are necessary for a company to export;

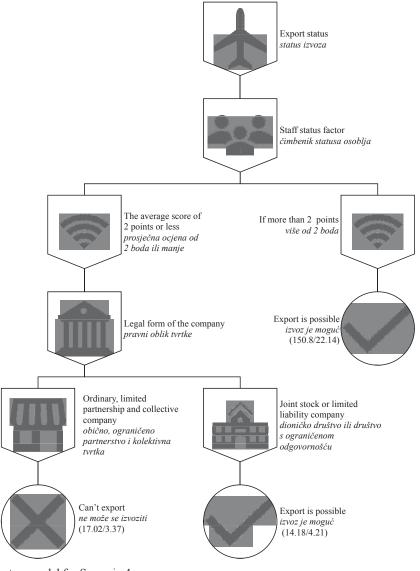
- 1. If the Manager has overseas experience,
- 2. If the Manager has no overseas experience, the firm can export if the Staff Situation factor score is greater than 3 and the Equity is greater than \$ 87,000.

The accuracy rate of the Scenario was found to be 92.9 %. This means that only 13 out of 182 companies were misclassified. Accuracy value was calculated as 0.932 and recall value was calculated as 0.929. ROC Area value was 0.947 and F score was 0.930. These values mean that the model is quite successful. The accuracy measure of the prediction, kappa statistic, was found to be 0.801 and proved that the prediction showed a very good level of fit.

#### 3.4 Scenario 4 and findings

#### 3.4. Scenarij 4. i zaključci

This Scenario that resulted from another model used the following variables: Competitive Status, Export Structure, Personnel Situation, Manager's overseas experience, Equity, Advertising Expenditures, Legal Structure of the Company, and Automation



**Figure 5** Decision tree model for Scenario 4 **Slika 5.** Model stabla odlučivanja za 4. scenarij

Utilization Rates. In this Scenario, Staff Situation, Qualified Personnel Procurement, In-Service Training and Personnel Environment Satisfaction are the most important factors. Accordingly, it is seen that companies with an average value of more than 2 can export. If the Staff Situation factor is less than 2 or 3, the Firm's Legal Form plays an important role in the decision tree. Accordingly, although the Staff Situation is less than 2, it is seen that companies with limited or joint stock status can export. However, if the legal form of the firm is Ordinary Company, Limited Partnership, Shared Limited Partnership or Collective Company, export is not possible.

According to this Scenario, in order for a firm to export, the Staff Situation factor score must be greater than 2 (Figure 5). If the Staff Situation factor score is 2 or less, the legal form of the firm should be Limited or Joint Stock Company. It was concluded that the Staff Situation factor score was 2 or less and the firm could not export if the legal form of the firm was ordinary, limited partnership or collective company.

In this Scenario, the following conditions are necessary for a firm to export;

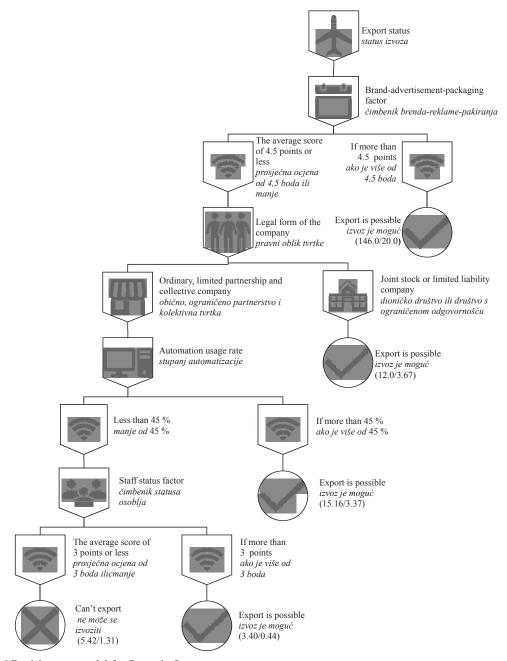
- 1. If the Staff Situation factor score is greater than 2,
- 2. If the Staff Situation factor score is less than 2, the firm may export if the legal form is limited liability or joint stock.

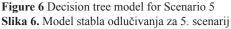
The accuracy rate of the scenario was found to be 92.9 %. This means that only 13 out of 182 companies were misclassified. Accuracy value was calculated as 0.932 and recall value was calculated as 0.929. ROC Area value was 0.947 and F score was 0.930. These values mean that the model is quite successful. The accuracy measure of the prediction, kappa statistic, was found to be 0.801 and proved that the prediction showed a very good level of fit.

#### 3.5 Scenario 5 and findings

#### 3.5. Scenarij 5. i zaključci

The variables used as inputs in this Scenario are Brand-Advertisement-Packaging, Competition Status, Export Structure, Economic and Environmental Factors, Management Style and Style, R & D Activities, Staff Situation, Manager's overseas experience, legal form of the company, automation and advertising expenditures.





In this scenario, the knots of the decision tree are Brand-Advertisement-Packaging factor, Legal structure of the company, Automation usage rate and Staff Situation factor.

According to this Scenario, a company must meet the following conditions in order to export (Figure 6):

- 1. Brand-Packaging-Advertising factor score should be higher than 4.5,
- 2. If Brand-Packaging-Advertising factor score is 4.5 or less, Legal Form should be Joint Stock or Limited Liability,
- 3. If the brand-packaging-advertising factor score is 4.5 or less and the legal form is ordinary, limited partnership or collective company, the automation usage rate should be more than 45 %,
- 4. If the Brand-Packaging-Advertising factor score is 4.5 or less and the legal form is ordinary, limited or collective company and the automation rate is less

than 45 %, the Staff Situation factor score should be higher than 3.

If the above conditions are not fulfilled, it is concluded that a company cannot export under this Scenario.

The accuracy rate of the Scenario was found to be 84.6 %. This means that 28 out of 182 data were misclassified. Accuracy value was calculated as 0.842 and recall value was calculated as 0.946. ROC Area value was 0.720 and F score was 0.835. These values mean that the model is successful. The accuracy measure of the prediction, i.e. kappa statistic, is found to be 0.476, proving that the prediction shows a moderate fit.

#### 3.6 Overview of scenarios

3.6. Pregled scenarija

In order to examine the scenarios as a whole, all the factors used and the subjects that cause branching

in the scenarios are discussed. The expressions shown in Scenario 1 (S1) to Scenario 5 (S5) show the scenario numbers and alternative ways to export in each scenario.

Consequently, there are 2 alternative routes in S3 and S4, 3 alternative routes in S1 and S2, and 4 alternative routes in S5.

In examining the findings of the scenarios, it can be seen that the staff situation factor comes to the fore in 4 scenarios. This is followed by the legal form of the company. Whether the legal form of the company is Joint Stock Company or Limited Company has been decisive in 3 scenarios. Overseas experience of the manager and equity have been identified as effective in 3 scenarios.

These findings show that the determination of the factors affecting the export, which constitutes the main subject of the study, is correct.

#### **4 DISCUSSION AND CONCLUSIONS** 4. RASPRAVA I ZAKLJUČAK

Export is an important opportunity that increases the welfare and competitiveness of countries. Thanks to exports, companies increase their sales, profits, capacity utilization, competitiveness, employment in the country, share in world markets and reduce foreign trade deficit.

In the last 5 years, the furniture industry has become an important economic industry with an annual value of 376 billion dollars. Socio-economic aspects of employment are also of considerable importance. In terms of furniture production and trade, EU countries have developed considerably compared to many regions of the world. Especially Germany and Italy are ahead of other European countries in terms of production, import and consumption. China has been a leader in furniture production in the world and has been leading the industry for the last five years. There is a significant potential for development and growth of the furniture industry in Turkey. When the furniture industry in Turkey is examined, it can be seen that the furniture companies aim to increase the export share by more than 2 % (Anadolu Agency, 2017).

Export performance is generally defined as the success of a company in international sales. Despite many studies to determine the determinants of export performance, there is no consensus on these determinants (Aaby and Slater, 1989; Madsen, 1989; Shoham, 1999a; Zou and Stan 1998). In various studies, it is seen that different export performance indicators and different measurements are used. This situation causes difficulties in the comparison of the studies. Therefore, in this study, efforts were made to identify common indicators that can evaluate export performance and measurements related to the issues affecting export.

In order to identify the factors affecting the export performance of the furniture industry in Turkey, a comprehensive literature study was carried out on companies engaged in the production of furniture by combining the factors and issues obtained in a survey of 182 furniture firms. The aim is to convey the findings to the executives, investors, decision makers and even academicians interested in the export industry.

In the study, efforts were made to draw meaningful results from the data obtained using data mining. Decision tree models, one of the data mining techniques, and J48 algorithm have been studied in 5 different scenarios.

In addition to these factors, the most important issues in the scenarios were found to be the corporate structure of the company, equity capital, overseas experience of managers, automation usage rates and advertising expenditures, and it was observed that these issues were effective in many scenarios. The determination of these issues was one of the important results obtained from the study.

The other important result and suggestion of our study is decision tree modeling should be conducted by using logistic regression findings of determinants / variables in order to produce more significant results. In case of so many variables, a decision tree may not give successful or clean modeling. Since pre-modeling by logistic regression may eliminate most of the relatively insignificant variables, this logistic regression promoted decision tree approach is recommended for future decision tree studies.

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