# OPTIMIZATION OF THE SURFACE ROUGHNESS BY APPLYING THE TAGUCHI TECHNIQUE FOR THE TURNING OF STAINLESS STEEL UNDER COOLING CONDITIONS

# UPORABA TAGUCHI-JEVE METODE ZA OPTIMIRANJE HRAPAVOSTI POVRŠINE PRI STRUŽENJU NERJAVNEGA JEKLA Z OHLAJANJEM

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Prejem rokopisa - received: 2014-11-14; sprejem za objavo - accepted for publication: 2015-01-16

doi:10.17222/mit.2014.282

This paper presents the optimization of the surface roughness using the Taguchi technique to assess the machinability of the AISI 316Ti steel with PVD coated carbide inserts under different cooling conditions such as dry, conventional (wet) and cryogenic cooling with liquid nitrogen (LN2). Based on the Taguchi  $L_9$  (3 $^3$ ) orthogonal-array design, the machinability tests were made utilizing a CNC lathe machine. Test parameters including the cutting speed, the cooling condition and the feed rate were taken and then the surface roughness ( $R_a$ ) was measured to obtain the machinability indicator. An analysis of variance was performed to determine the importance of the input parameters for the surface roughness. The process parameters were optimized by taking the Taguchi technique into consideration. The Taguchi signal-to-noise ratio was employed with the smaller-the-better approach to obtain the best combination. On the basis of the first-order model, a mathematical model was created using the regression analysis to predict the  $R_a$  model. The results indicate that the feed rate is the parameter with the highest effect on the surface roughness and that the other parameters also have a statistical significance. In addition, cryogenic cooling is an alternative method for increasing the surface quality of machined parts.

Keywords: AISI 316Ti, cryogenic cooling, machinability, optimization, surface roughness, Taguchi method

Članek obravnava optimiranje hrapavosti površine z uporabo Taguchi-jeve metode za oceno obdelovalnosti jekla AISI 316Ti s karbidnimi vložki s PVD-nanosom v različnih razmerah ohlajanja, kot je suho, navadno (mokro) in kriogensko hlajenje s tekočim dušikom (LN<sub>2</sub>). Preizkusi obdelovalnosti so bili izvršeni s CNC-stružnico na osnovi Taguchi-jevega ortogonalnega niza L<sub>9</sub> (3³). Izbrani so bili parametri preizkusov, hitrost rezanja, razmere pri ohlajanju in hitrost podajanja, nato pa je bila izmerjena hrapavost površine ( $R_a$ ) kot pokazatelj obdelovalnosti. Izvršene so bile analize variance, da bi ugotovili pomembnost vhodnih parametrov na hrapavost površine. Procesni parametri so bili optimirani z upoštevanjem Taguchi-jeve tehnike. Uporabljeno je bilo Taguchi-jevo razmerje signal – hrup s približkom čim manjše tem boljše za doseganje najboljše kombinacije. Na osnovi modela prvega reda je bil postavljen z uporabo regresijske analize matematični model za napovedovanje  $R_a$ . Rezultati kažejo, da je hitrost podajanja parameter z največjim učinkom na hrapavost površine, vsi drugi parametri imajo statistično značilnost. Dodatno je kriogensko ohlajanje alternativna metoda za povečanje kvalitete površine struženih delov.

Ključne besede: AISI 316Ti, kriogensko ohlajanje, obdelovalnost, optimizacija, hrapavost površine, Taguchi-jeva metoda

# 1 INTRODUCTION

Stainless steels were developed to obtain a better corrosion resistance compared to traditional carbon steels and they allow us to work at higher temperatures. There is a lot of stainless steel in the industry, but austenitic and ferritic stainless steels are commonly used in the manufacturing industry.1 As a type of the AISI 316 steel, austenitic stainless steel AISI 316Ti contains low amounts of titanium (Ti), approximately 0.5 %. This steel type has the advantage of enduring higher temperatures for a longer time compared to the other stainless steels.<sup>2</sup> The physical and mechanical properties of the AISI 316Ti steel are similar to those of the other types of 316, but the corrosion resistance of 316Ti is better than those of the standard grades.<sup>2</sup> In recent years, due to its different properties, this steel has been extensively used for certain applications such as boat and ship parts, medical and chemical handling equipment, heat exchangers, fastening tools, and in nuclear and construction industries where a low thermal conductivity, good heat resistance and corrosion resistance and a high strength are required in the high-temperature working conditions. However, the machining of this austenitic stainless steel is very difficult since it contains a high amount of strength-enhancing elements such as chromium, nickel and molybdenum.<sup>1</sup> One of the major problems is the heat generation at the cutting region during the machining of difficult-to-cut metals. The machining process requires more energy, so high temperatures occur throughout the deformation process and the friction at the tool-chip and tool-workpiece interfaces.3 Recently, the machining technology has been quickly improved to increase the processing productivity and machining performance in the cases of difficult-to-cut steels. An increase in the productivity can be achieved by decreasing the temperature

at the tool-chip and tool-workpiece interfaces thanks to the cooling/lubrication methods. As the cutting velocity and the feed rate increase during a machining process, due to an improvement in the coating technology, the cutting temperature increases as well. Thus, the use of cooling/lubrication is necessary during the metal-cutting operations. In recent years, certain cooling/lubrication methods such as cryogenic cooling, solid coolants/lubricants, wet cooling (traditional cooling), minimum-quantity lubrication, high-pressure coolants, compressed air/gases have been employed and these technologies have considerably increased the machining productivity.4 However, the use of mineral- or syntactic-based cutting fluids has led to certain problems like health risks and environmental pollution.<sup>5,6</sup> In order to eliminate all the cutting fluids from the metal-cutting process, cryogenic cooling or high-pressure cooling with compressed air can be applied to protect the health and the environment.

Surface roughness is one of the most critical quality indicators of the machined surfaces of engineering materials used for important applications and the producers believe that it determines the degree of surface quality of the manufactured parts.6 A low surface roughness obtained from machining experiments contributes to some properties of workpiece including fatigue strength, corrosion and wear resistance, friction, etc.<sup>6,7</sup> Surface roughness is affected by many parameters such as machined material, depth of cut, cutting-tool material, cutting speed, tool-nose radius, feed rate, coating type and cooling/lubrication conditions. Modern industry aims at producing high-quality parts, reducing the costs in a short time. To manufacture a product with a desired quality of the machining, the optimum process parameters should be chosen. Therefore, recently, certain statistical methods like the Taguchi technique, response-surface methodology (RSM), desirability function analysis, ANOVA and grey relational analysis (GRA) have been implemented to optimize and analyze process parameters.<sup>8-12</sup> In the engineering applications and academic studies of experimental design, the Taguchi method is very useful thanks to the orthogonal array that significantly reduces the number of the tests and, in addition, it attempts to eliminate the influence of uncontrollable factors on the test results. The main purpose of the Taguchi technique is to provide quality during the design stage. In this way, the cost and the test time decrease in a shorter period. 12,13 Therefore, in this study, the Taguchi method with the L9 orthogonal array was employed.

In some studies, the machinability of austenitic stainless steel was investigated by the researchers. For example, Kayir et al.<sup>1</sup> studied the effect of the tool geometry and the cutting parameters on the surface roughness in machining AISI 316Ti under dry cutting conditions. Their results demonstrated that the main parameters were the feed rate with a 73.97 % effect and the radius of the edge with a 13.26 % effect on the surface roughness. Xavior and Adithan<sup>14</sup> explored the effects of cutting

fluids, cutting speed, depth of cut and feed rate on the tool wear and surface roughness in the turning of the AISI 304 austenitic stainless steel using a carbide tool. It was seen that the most important parameter was the feed rate having a 61.54 % effect on the surface roughness, while the cutting speed had a 46.49 % effect on the tool wear. Further, according to the ANOVA analysis, it was found that the cutting fluid had a considerable effect on both the surface roughness and the tool wear. Ciftci<sup>15</sup> investigated the influence of the cutting speed and the tool coating on the surface roughness and the cutting force in the turning of the AISI 304 and AISI 316 austenitic stainless steels under dry cutting conditions. It was reported that the cutting speed considerably affected the surface roughness. Korkut el al.16 determined the best cutting parameters in the turning of the AISI 304 austenitic stainless steel with cemented carbide inserts. Their results showed that the surface roughness decreased with the increasing cutting speed. Tekiner and Yeşilyurt<sup>17</sup> investigated the influences of the cutting parameters on the basis of the process noise in the turning of the AISI 304 austenitic stainless steel. It was found that the cutting speed of 165 m/min and the feed rate of 0.25 mm/r gave the best results.

The literature survey indicates that there are very few studies dealing with the turning of the AISI 316 stainless steel. When these studies are examined, it is seen that the surface roughness has not been evaluated with respect to different cutting conditions like dry, wet and cryogenic cooling procedures used during the turning of the AISI 316Ti stainless steel. In the light of the above information, this study can be summarized in three points: Firstly, the influences of the cutting parameters on the surface roughness in the turning of the AISI 316Ti stainless steel with a PVD coated carbide insert were investigated under dry, wet and cryogenic cooling conditions. Secondly, a mathematical model was formed to estimate the result of different levels of input parameters using a regression analysis. In the next process, an analysis of variance (ANOVA) was applied to determine the influences of the machining parameters. Lastly, the process parameters were optimized using the Taguchi technique. To achieve its goals, this paper employed a Taguchi L<sub>9</sub>

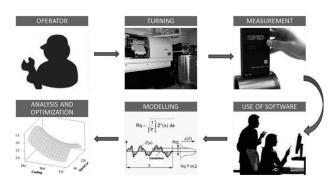


Figure 1: General flow diagram of the study Slika 1: Prikaz poteka študije

(3<sup>3</sup>) orthogonal array for planning the experiments. An experimental design including three parameters (feed rate, cutting speed and cooling condition) with three levels was organized.

#### 2 EXPERIMENTAL PROCEDURE

The workflow diagram of this study is illustrated in **Figure 1**. It shows the sequence of the performed study.

**Table 1:** Chemical composition of the material in mass fractions, w/% **Tabela 1:** Kemijska sestava materiala v masnih deležih, w/%

С	Mn	Si	P	S	Cr	Ni	Mo	Cu	Ti
0.021	1.775	0.495	0.036	0.019	16.74	10.92	2.15	0.536	0.318

# 2.1 Material, machine tool, cutting tool and measurement

The AISI 316Ti workpiece material was used in the turning experiments and its chemical composition is given in Table 1. Recently, because of its unique properties including good heat resistance and corrosion resistance, a low thermal conductivity and a high strength at higher temperatures, this material has been used in many engineering operations involving boat and ship parts, medical and chemical handling equipment, heat exchangers, fastening tools, and in the nuclear and construction industry. The dimensions of the test material were  $\emptyset$  60 mm  $\times$  200 mm. All the turning tests were conducted using a Falco Fl-8 model (Taiwan) CNC lathe machine with the maximum spindle speed of 4800 r/min and a 15 kW drive motor. An assembly produced by Sandvik including a PVD coated carbide insert of type SNMG 12 04 08-QM and a PSBNR 2020K-12 tool holder was utilized as the main tool arrangement with the following tool geometry: a rake angle of -6°, a clearance angle of 0°, the major cutting-edge angle of 75°, a cutting-edge inclination angle of -6 ° and a nose radius of 0.8 mm. The same type of cutting insert was employed for each test parameter. In engineering applications, surface quality is one of the most important quality indicators. For this reason, the average value of the surface roughness  $(R_a)$  was measured using a TIME TR 100 profilometer tester. Before the measurements of the surface roughness, the measuring device was calibrated with a special calibration. Each surface was machined by using a new cutting insert and after each test measurements were carried out on the workpiece.

## 2.2 Cutting conditions and design of the experiments

The cutting speed ( $V_c$ ), the feed rate (f) and the cooling condition (C) were taken as the cutting parameters. The values of the cutting parameters were chosen from the plot experiments and the manufacturer's handbook. During the machining tests, a constant depth of cut ( $a_p = 1.6 \text{ mm}$ ) was used; the other cutting parameters and their levels are given in **Table 2**. In this study, on the basis of

the control factors and their levels from **Table 2**, the Taguchi  $L_9$  orthogonal array (OA) from the Minitab software was used, as shown in **Table 3** indicating the design of the experiments. It has nine rows and three columns. The rows correspond to the number of the tests; the columns correspond to the process parameters with three levels. In this array, the first, second and third columns represent the cutting speed, feed rate and cutting condition, respectively. The tests were conducted under different cutting conditions such as dry cutting, conventional wet cooling (flood coolant) and cryogenic cooling inside the tool with liquid nitrogen (LN<sub>2</sub>). For wet cooling, a solution with boron oil and water (the ratio of boron oil/water = 1/20) was prepared.

**Table 2:** Process parameters and their levels **Table 2:** Procesni parametri in njihovi nivoji

Code	Control	Notation	Levels of factors				
Code	parameter	Notation	Level 1	Level 2	Level 3		
A	Cooling condition	С	Dry	Wet	Cryogenic		
В	Feed rate	f/(mm/r)	0.1	0.16	0.25		
С	Cutting Speed	V <sub>c</sub> / (m/min)	90	126	176		

**Table 3:** Experimental design **Tabela 3:** Načrt eksperimentov

Exp.	Co	ded val	ues	Actual values				
no.	A	В	С	C	f/(mm/r)	$V_{\rm c}/({\rm m/min})$		
1	1	1	1	Dry	0.1	90		
2	1	2	2	Dry	0.16	126		
3	1	3	3	Dry	0.25	176		
4	2	1	2	Wet	0.1	126		
5	2	2	3	Wet	0.16	176		
6	2	3	1	Wet	0.25	90		
7	3	1	3	Cryogenic	0.1	176		
8	3	2	1	Cryogenic	0.16	90		
9	3	3	2	Cryogenic	0.25	126		

For the cryogenic cooling, liquid nitrogen was delivered directly from the liquid-nitrogen pressure tank to the tool holder at a pressure of 1.5 bar as shown in **Figure 2**. Three holes were drilled into the tool holder. The diameter of the first hole on the tool holder was 6 mm and it provided a connection between the tool holder

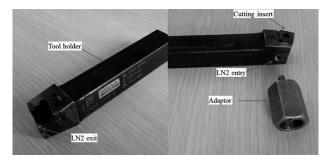


Figure 2: Modified tool holder and adaptor Slika 2: Prirejen nosilec orodja in adapter

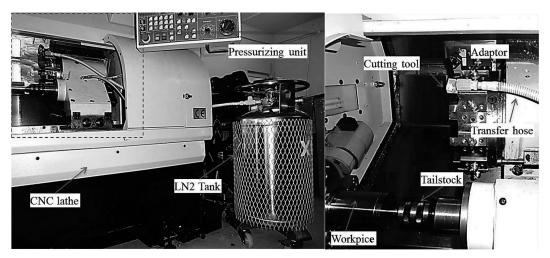


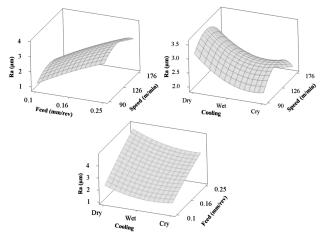
Figure 3: Experimental set-up Slika 3: Eksperimentalni sestav

and the liquid-nitrogen container with the help of a hose and an adaptor. The liquid nitrogen accumulated inside the tool holder was released to the environment as a gas vapor with the help of the other two holes, taking the heat from the insert. The diameter of the gas exit holes was made to be 1.5 mm. The modified tool holder and the connection adapter are seen in **Figure 2**, while **Figure 3** shows the experimental set-up for cryogenic cooling.

## 3 RESULTS AND DISCUSSION

# 3.1 Analysis of the experimental results

Surface roughness is one of the most important quality criteria for engineering materials. During the turning operations, the surface roughness can be controlled with the machining parameters. In this study, the surface roughness was evaluated using 3D surface plots in the graphs given in **Figure 4**. This figure shows that the surface roughness increased significantly with the increasing feed rate. The reason for this can be the fact that an



**Figure 4:** Effects of machining parameters on the surface roughness **Slika 4:** Vpliv parametrov obdelave na hrapavost površine

increase in the feed rate leads to a vibration and increases the heat at the tool-chip interface; thereby a higher surface roughness occurs. <sup>18</sup> To calculate the theoretical surface roughness, the abbreviated formula is expressed as follows:

$$R_{\rm a} = \frac{f^2}{32 \cdot r} \tag{1}$$

According to Equation (1), in order to improve the surface quality, the feed rate can be decreased or, alternatively, the nose radius of the cutting insert can be increased since the surface roughness is a function both the nose radius and feed rate. The results obtained from the experiments are similar to this formula. In the literature, it is pointed out that surface roughness is affected negatively by an increase in feed rate and in order to obtain the better surface quality, the feed rate is reduced usually in machining processes. <sup>6,8,13</sup> In present work, a similar result was detected when the surface roughness decreased with the increasing of feed rate.

According to **Figure 4**, the surface roughness showed a decreasing tendency with an increase in the cutting speed. An improvement in the surface quality was observed with the increasing cutting speed because the increasing temperature during the cutting process made the plastic deformation and the chip flow easier.<sup>6,18</sup> Further, it is thought that because of a reduction in built-up edge (BUE) and built-up layer (BUL) formations, tool wear was affected positively, and so this situation gives rise to an improvement in the surface quality.<sup>6</sup>

During a manufacturing process, physical and chemical properties of the coolants allow a reduction in thermal/mechanical-based damages. When coolants are used efficiently, the dimensional accuracy and a better surface quality may occur; also, a longer life of the cutting tool may be obtained. **Figure 4** shows a significant change in the surface-roughness values, depending on the use of different cooling methods. It can be seen that the surface roughness is minimum when using cryogenic

cooling. This may be due to a lower cutting temperature, a lower adhesion between the cutting insert and the machined-workpiece surface and a lower tool-wear rate compared to dry and wet cooling conditions. <sup>19</sup> In addition, a reduction in the surface roughness due to wet cooling was determined in comparison with dry machining.

#### 3.2 Signal-to-noise (S/N) analysis

The surface roughness (Ra) was evaluated with an orthogonal array for each combination of the test parameters using the Taguchi technique and an optimization of the process parameters was achieved with signal-tonoise (S/N) ratios. Here, the signal data includes the desired influence on the test results and the noise data includes the undesired influence on the test results. Therefore, the maximum S/N ratio provides the optimum results. There are three different ways of calculating the S/N ratios. These are the nominal-is-best, the smallerthe-better and the larger-the-better approaches. In the present study, the smaller-the-better option of the S/N quality characteristic was utilized to obtain the best combination for the surface roughness with respect to the desired low  $R_a$ . The smaller-the-better approach is expressed as follows:7

Smaller-the-better (minimize):

$$\frac{S}{N_{R_a}} = -10 \log \left[ \frac{1}{n} \sum_{i=1}^{n} o_i^2 \right]$$
 (2)

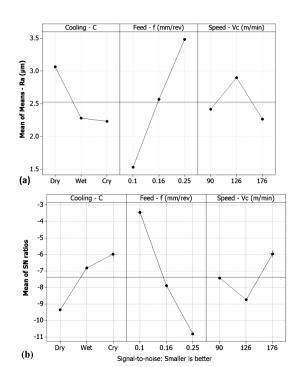


Figure 5: Main effect plots for: a) means and b) S/N ratios Slika 5: Diagram učinka za: a) sredstva in b) razmerje S/N

In Equation (2),  $o_i$  is the response of the output characteristic for the  $r^{th}$  test and n is the number of the outputs of the test.

The experimental results and their S/N ratios were calculated using Equation (2) as given in Table 4. From this table, the mean surface roughness and the mean S/N ratio were calculated as 2.53 µm and -7.39 dB, respectively. The analysis of the process parameters like the cutting speed, feed rate and cooling condition was made using an S/N response table obtained with the Taguchi method as seen in **Table 5**. The S/N response table of the results gives the optimum points of the process parameters for the best surface roughness. Figure 5 was plotted to determine the optimum control factor of a machining parameter using the S/N response table. As seen in **Figure 5**, for the highest S/N ratio, the optimum parametric combination was found to be factor A (level 3, S/N = -5.985 dB, mean: 2.283 µm), factor B (level 1, S/N = -3.450 dB, mean: 1.533  $\mu$ m) and factor C (level 3, S/N = -5.975 dB, mean: 2.267  $\mu$ m).

Under cryogenic cooling, the cutting speed was 176 m/min and the feed rate was 0.1 mm/r.

**Table 4:** Experimental results and their *S/N* values **Tabela 4:** Rezultati eksperimentov in njihove *S/N* vrednosti

	Cont	rol parame				
Test no.	A Cooling condition	B Feed rate f/(mm/r)	C Cutting speed V <sub>c</sub> / (m/min)	Surface roughness $R_{\rm a}/\mu{\rm m}$	Signal to noise (S/N)/dB	
1	Dry	0.1	90	1.90	-5.5751	
2	Dry	0.16	126	3.55	-11.0046	
3	Dry	0.25	176	3.75	-11.4806	
4	Wet	0.1	126	1.65	-4.3497	
5	Wet	0.16	176	2.00	-6.0206	
6	Wet	0.25	90	3.20	-10.1030	
7	Cryogenic 0.1		176	1.05	-0.4238	
8	Cryogenic	0.16	90	2.15	-6.6488	
9	Cryogenic	0.25	126	3.50	-10.8814	

**Table 5:** Response table **Table 5:** Table odgovorov

	Co	ntrol fact	tors	Control factors			
Levels	-	S/N ratios	S	Means			
	A	В	C	A	В	В	
Level 1	-9.353	-3.450	-7.442	3.067	1.533	2.417	
Level 2	-6.824	-7.891	-8.745	2.283	2.567	2.900	
Level 3	-5.985	-10.822	-5.975	2.283	3.483	2.267	
Delta	3.369	7.372	2.770	0.833	1.950	0.633	
Rank	2	1	3	2	1	3	

#### 3.3 Analysis of variance

Analysis of variance (also known as ANOVA) is a statistical method and the significance of the machining parameters was identified with its help. The ANOVA analysis was performed with a 95 % confidence level and

5 % significance level. The *F* values of the control factors indicated the significance of the control factors determined with the ANOVA analysis. The percentage contribution of each parameter is shown in the last column of the ANOVA table. The column shows the effect rates of the input parameters on the outputs.<sup>6</sup>

In the present work, the ANOVA results are given in **Table 6** and, in addition, these results are graphically presented in **Figure 6**. The ANOVA results indicate that the cooling condition, the feed rate and the cutting speed influenced the surface roughness by 17 %, 74.1 % and 8.5 %, respectively. Therefore, the feed rate (factor *B*) is the most important factor affecting the surface roughness. According to **Table 6**, it can be said that the cooling condition, the feed rate and the cutting speed had a statistical and physical significance with regard to the surface roughness at the reliability level of 95 % because their *P* values are lower than 0.05.

**Table 6:** ANOVA analysis **Tabela 6:** Analiza ANOVA

Factors	Degree of free- dom	Sum of squares	Mean of squares	$F$ ratio, $\alpha = 0.05$	P	Contribution (%)
Cooling method	2	1.3106	0.6553	48.14	0.020	17
Feed rate	2	5.7106	2.8553	209.78	0.005	74.1
Cutting speed	2	0.6572	0.3286	24.14	0.040	8.5
Error	2	0.0272	0.0136			0.35
Total	8	7.7056				100

# 3.4 Regression analysis

In many studies, a regression analysis was used to determine the relationship between the control factors and experimental results. In the present work, the control factors are the cutting speed ( $V_c$ ), the feed rate (f) and the cooling condition (C) and the surface roughness ( $R_a$ ) is the response. On the basis of the first-order model, a mathematical model was created using a regression analysis for predicting  $R_a$ . The first-order model can be expressed with Equation (3):

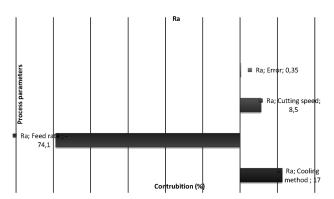


Figure 6: Graphical representation of the ANOVA results Slika 6: Grafičen prikaz rezultatov ANOVA

$$y = \beta_0 + \beta_1 \cdot v_1 + \beta_2 \cdot v_2 + \beta_3 \cdot v_3 \tag{3}$$

In this equation, y is the corresponding output, and  $v_1$ ,  $v_2$ , and  $v_3$  are the values of the variable. The term  $\beta$  is the regression coefficient. The first-order model can be written as a function of the cooling condition (C), the feed rate (f) and the cutting speed  $(V_c)$ . The relationship between the output and the turning parameters from Equation (3) was adapted as given in following Equation (4):

$$R_{a_{max}} = \beta_0 + \beta_1 \cdot C + \beta_2 \cdot f + \beta_3 \cdot V_{c}$$
 (4)

According to the above equations, a mathematical model for the surface roughness with coded values (**Table 3**) can be written in the following way:

$$R_{\rm a_{pre}} = 1.56111 - 0.416667 \cdot C + 0.975 \cdot f - 0.075 \cdot V_{\rm c} \quad (5)$$

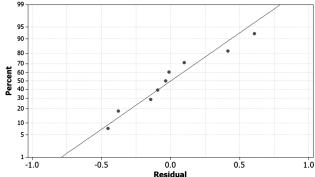
$$R^2 = 87.98 \, \%$$

The determination coefficient, expressed as  $R^2$ , shows the reliability of the predicted model. It was recommended that  $R^2$  should be between 0.8 and 1.20 In this study, the value of the determination coefficient is  $R^2 = 0.8798$  and it is high enough, demonstrating a high significance of the predicted model. In order to evaluate the contents of the residual of the model, a graphical technique was employed. The sufficiency of the models was investigated by examining the residuals. The normal-probability plot of the residuals for the surface roughness is seen in **Figure 7**. It is seen that the residual rather appropriately tend towards a straight line, meaning that errors are normally delivered. This demonstrates that the predictive model is satisfactory.

## 3.5 Determining the optimum surface roughness

In the last phase of the Taguchi method, a verification experiment has to be made to check the reliability of the optimization. The verification experiment was conducted at the optimum levels of the variables determined as seen in **Figure 5**.  $A_3$ - $B_1$ - $C_3$  and their values from this figure were employed to calculate the estimated optimum surface roughness. The equation for estimating the optimum result ( $R_{a_{opt}}$ ) was expressed as follows:

$$R_{a_{\text{ont}}} = (A_3 - T_{R_a}) + (B_1 - T_{R_a}) + (C_3 - T_{R_a}) + T_{R_a}$$
 (6)



**Figure 7:** Normal-probability plot of the residuals **Slika 7:** Diagram normalne verjetnosti preostankov

In Equation (6),  $A_3$ ,  $B_1$ , and  $C_3$  are the mean values of the surface roughness at the optimum level as seen in **Table 5**.  $T_{R_a}$  is the mean of all the  $R_a$  values obtained from the experimental results (**Table 4**). According to Equation (6),  $R_{a_{opt}}$  is 1.023  $\mu$ m.

In order to verify the result of the estimated surface roughness, the confidence interval (*CI*) was calculated using following equations:<sup>22</sup>

$$CI = \sqrt{F_{\alpha,1,\text{Ve}} \cdot V_{\text{ep}} \cdot \left(\frac{1}{n_{\text{eff}}} + \frac{1}{R}\right)}$$
 (7)

$$n_{\text{eff}} = \frac{N}{1 + T_{\text{dof}}} \tag{8}$$

In Equation (7),  $F_{\alpha,1,Ve}$  is the F ratio at the 95 % confidence level,  $\alpha$  is the significance level,  $V_e$  is the degree of freedom of the error,  $V_{ep}$  is the error variance,  $n_{eff}$  is the effective number of replications, R is the number of replications for the verification test. In Equation (8), N is the total number of tests and  $T_{dof}$  is the total main factor of the degree of freedom.

According to the F test table,  $F_{\alpha,1,2}$  is 18.51. Further,  $V_{\rm ep} = 0.0136$ , R = 3, N = 9,  $T_{\rm dof} = 6$  and, according to Equation (8),  $n_{\rm eff}$  is 1.285. The confidence interval (*CI*) is found to be 0.528 using Equations (7) and (8). The predicted optimum surface roughness with the 95 % confidence interval is:

$$[R_{a_{opt}} - CI] < R_{a_{exp}} < [R_{a_{opt}} + CI]$$
, i.e.,  $[1.023 - 0.528] < 1.05 < [1.023 + 0.528] = 0.702 < 1.05 < 1.551$ .

The  $R_{\text{aexp}}$ , which was found with the experiments, was within the confidence interval limit. Therefore, the system optimization was successfully achieved using the Taguchi method at a significance level of 0.05 in the turning of the AISI 316Ti stainless steel under different cutting conditions.

## 3.6 Experimental validation

Verification experiments of the process parameters were performed for the best result and the predictive model at the optimum and at random points. **Table 7** shows a comparison of the experimental results and the estimated results obtained with the Taguchi technique and mathematical model (Equation (5)). It was seen that the estimated results and the test results are quite close.

**Table 7:** Verification of the test results **Table 7:** Preverjanje rezultatov preizkusov

	Tagu	chi techi	nique	First	First-order model			
Level	Exp.	Pre- dicted	Error (%)	Exp.	Pre- dicted	Error (%)		
$A_3B_1C_3$ (optimum)	1.05	1.023	1.8	1.05	1.06	0.9		
$A_3B_2C_1$ (random)	2.15	2.19	1.82	2.15	2.16	0.4		
$A_2B_1C_2$ (random)	1.65	1.55	6.06	1.65	1.66	0.6		

The errors of the statistical analysis must be below 20 % for the reliability of the analysis.<sup>20</sup> Therefore, the results found in the verification experiment showed that the optimization was successful.

## **4 CONCLUSIONS**

This study focused on the influences of the process parameters such as the cooling condition, the feed rate and the cutting speed on the surface roughness ( $R_a$ ) in the turning of the AISI 316Ti stainless steel and an optimization was achieved on the basis of the Taguchi method. Cryogenic cooling using liquid nitrogen (LN<sub>2</sub>) was applied from within a modified tool holder. The Taguchi S/N ratio was utilized with the smaller-the-better approach to obtain the optimum values. An analysis of variance was performed to define the importance of the process parameters for the outputs. Based on the first-order model, a mathematical model was created, namely  $R_{\rm apre}$ , using the regression analysis. The results obtained from this study can be summarized as follows:

The best parameter levels were found to be  $A_3$ - $B_1$ - $C_3$  (i.e., cutting condition = cryogenic cooling, feed rate = 0.1 mm/r and cutting speed = 176 m/min). Cryogenic cooling with LN<sub>2</sub> and a modified tool holder provided a better performance than dry and wet conventional cooling in terms of the surface roughness and may be recommended for use in the turning of the AISI 316Ti stainless steel.

Although the surface quality decreased with an increase in the feed rate, it showed an improvement tendency with an increase in the cutting speed and with the use of the cryogenic cooling and wet (traditional) cooling.

Using ANOVA, it was found that the feed rate is the dominant factor affecting the surface roughness, with a fraction of 74.1 %, followed by the cooling method and the cutting speed. Further, it was seen that the cooling condition, the feed rate and the cutting speed had statistical and physical significance for the surface roughness, with a reliability level of 95 %.

The regression model showed a high correlation between the experimental and predicted values. Further, the normal-probability plot of the residuals for the surface roughness showed that the residuals quite appropriately tended to a straight line, meaning that errors were normally delivered. This proved that  $R_{\rm apre}$  was satisfactory and quite reliable. In addition, the value of the determination coefficient was high enough.

In the verification experiment, the measured values were within the 95 % confidence interval (*CI*).

Future work may deal with analyzing the effects of some cooling/lubrication methods like the minimum-quantity lubrication (MQL), high-pressure cooling with a coolant, high-pressure cooling with compressed air, and external cryogenic cooling during the machining of the AISI 316Ti stainless steel. Further, other process para-

meters like the cutting-tool geometry, depth of cut, CVD coated inserts, uncoated carbide inserts, nose radius, and chip-breaker geometry may be considered by the researchers to define their influences on the tool life and surface quality in future academic studies.

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