



Development of mathematical model and optimization of GMA welding parameters of IS 2062 grade A steel weldments

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ABSTRACT. In this experimental work, the effects of Gas metal arc (GMA) welding process parameters, such as arc voltage, wire feed speed, and gas flow rate on the mechanical quality of IS 2062 structural steel of grade A have been studied. Process parameters play an important role in determining the weld quality. In this research work the response surface methodology (RSM) via the design expert version 12 (DOE) software was applied to determine the weld quality, for 3D plot, maximize desirability for all response, and also to develop a mathematical model that can predict the main effect of the listed parameters on weld quality i.e. toughness and hardness. A set of experiments has been conducted to collect the response data using a central composite design and ANOVA was used to predict the impact of welding parameters on toughness and hardness. The obtained and predicated results were compared and it was verified that toughness and hardness of weldments are significantly affected by arc voltage and wire feed speed while gas flow rate has a minor effect.

KEYWORDS. Response surface methodology (RSM); Centre composite design (CCD); Modeling; Optimization; GMA welding; Mechanical quality.



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INTRODUCTION

IS 2062 structural steel is frequently used in fabrication industries due to its good weldability, good tensile strength (UTS), toughness, easy availability, economical etc. In this work, gas metal arc (GMA) welding process was used to join this grade A steel. Now a day's gas metal arc welding process is frequently used to weld various materials as it is a semi automatic joining process and can even be used as automatic. In GMA welding process a copper coated mild steel



wire is used as a filler wire [1]. Several statistical and computational techniques such as response surface methodology, ANN, and Taguchi [2] techniques were applied to develop the mathematical modeling and process parameters optimization. Response surface methodology (RSM) is a powerful mathematical tool used to optimize the process parameters in processes such as machining, welding, and casting etc [3-5] and also used to develop a mathematical model [6] and it minimize the number of experiments. Muralimohan Cheepu et al [7] developed a mathematical model and optimize the welding process parameters during the laser welding of titanium alloys and compared the obtained results from response surface methodology with experimental results. Shekhar Srivastava and R.K. Garg[8] developed a mathematical model and optimized GMA welding process parameters during the welding of IS2062 via RSM approach . They verified that the wire feed speed has a significant effect, followed by arc voltage and travel speed. Sanjay A. Swami et al [9] investigated the effect of GMA welding parameters on the mechanical properties of mild steel by designing the experiments using central composite matrix. They concluded that on increasing the CO₂ gas percentage in Ar gas ultimate tensile strength (UTS) increase up to some extend and then decreases. A G Kamble and R Venkata Rao [10] studied the effect of GMA welding process parameters on AISI 202 steel weldments and developed a model for mechanical properties and they showed in their results that higher the arc voltage decreases the hardness and mechanical quality but increases with increasing in welding speed. In the present experimental research work the effect of GMA welding process parameters on the toughness and hardness of IS2062 structural steel of grade A weldments were investigated and a mathematical model was developed by response surface methodology. Scanning electron microscopy (SEM) micro-morphology fracture surface of toughness test samples was studied to determine the ductile or brittle fracture.

EXPERIMENTAL PROCEDURE

In this research work, IS 2062 structural work of grade A in form of plate of size 300 mm x 60 mm x10 mm was used as parent metal. Gas metal arc (GMA) welding process was used to weld the parent metal in the shielding environment of 75% Ar+25% CO₂ gas mixture. ER70S-6 of Ø 2 mm is used as filler wire to join the parent metal. Chemical composition of parent metal and filler wire is mentioned in Tab. 1.

Material	C	Mn	S	P	Si	Fe
IS 2062	0.22	1.5	0.049	0.05	0.37	Bal.
ER70S-6	0.20	1.61	0.025	0.025	0.98	Bal.

Table 1: Chemical composition of parent metal and filler wire (wt.%)

Tab. 2 illustrates the different selected input parameters of GMA welding with their corresponding level, their notation, and unit in actual form. The proposed experimental design involves the variation of three factors (arc voltage, wire feed speed, and gas flow rate) at three levels. Welding trials were completely conducted based on central composite design of experiments associated with twenty numbers runs.

Factors	Notation	Unit	Level		
			-1	0	+1
Arc Voltage	V	V	25	26	27
Wire feed speed	WF	IPM	300	350	400
Gas flow rate	GF	lpm	10	15	20

Table 2: Process parameters and their level

Design matrix is shown in Tab. 3. Toughness test samples before fracture and after fracture are showed in Fig. 1.

Std run	Experimental run	Arc voltage (V)	Wire feed speed (Ipm)	Gas flow rate (lpm)	Toughness (J)	Hardness (VHN)
9	1	24	350	15	200	178
6	2	27	300	20	156	181
16	3	26	350	15	266	161
5	4	25	300	20	188	186
13	5	26	350	6	258	199
20	6	26	350	15	261	159
3	7	25	400	10	186	165
1	8	25	300	10	242	171
15	9	26	350	15	274	165
19	10	26	350	15	255	162
12	11	26	434	15	188	182
2	12	27	300	10	214	196
8	13	27	400	20	190	180
10	14	28	350	15	208	206
18	15	26	350	15	268	150
4	16	27	400	10	192	181
14	17	26	350	23	194	186
17	18	26	350	15	260	155
11	19	26	266	15	156	189
7	20	25	400	20	202	175

Table 3: DOE table with responses

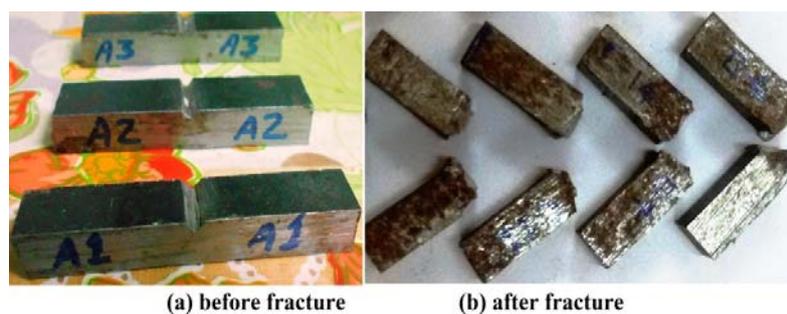


Figure 1: toughness test samples.

RESULT AND DISCUSSION

Development of mathematical model

In this work arc voltage (V), wire feed speed (F), and gas flow rate (L) were selected as welding process parameters. Mechanical properties, i.e. toughness and hardness of welded joints, are significantly affected by welding parameters and it is very clear from previous research work that toughness and hardness of IS 2062 steel weldments is



considerably influenced by arc voltage and wire feed speed [11]. In regression analysis [12] as expressed by Eq. (1), an experimental mathematical model was generated in between the toughness, hardness, and independents variable [13] and check for its adequacy. Response surface methodology is also used based on central composite design (CCD) to develop a model to predict the mechanical quality and checked by ANOVA for its adequacy [14]. The mechanical properties dimensions response function can be expressed as Eqn. (1):

$$Y_{trans} = f(x_1, x_2, x_3, x_4, \dots, x_n) \quad (1)$$

where Y_{trans} is the power transformation of the welding parameters and x_n represent the input parameters. x_1 =arc voltage, x_2 =wire feed speed, and x_3 =gas flow rate selected as welding input parameters in this experimental work. Usually 2nd order Eqn. (2) can be expressed [15] as:

$$y = d_o + \sum_{i=1}^k d_i X_i + \sum_{i=1}^k d_{ii} X_i^2 + \sum_i \sum_j^k d_{ij} X_i X_j + \epsilon \quad (2)$$

where y is the response (toughness and hardness) variable, x_i is the uncoated level of the variables, ϵ is the fitting error, the coefficient d_o is the constant value or intercept, and coefficients d_i, d_{ii} , and d_{ij} represent the linear, quadratic, and interaction terms of the variable, respectively.

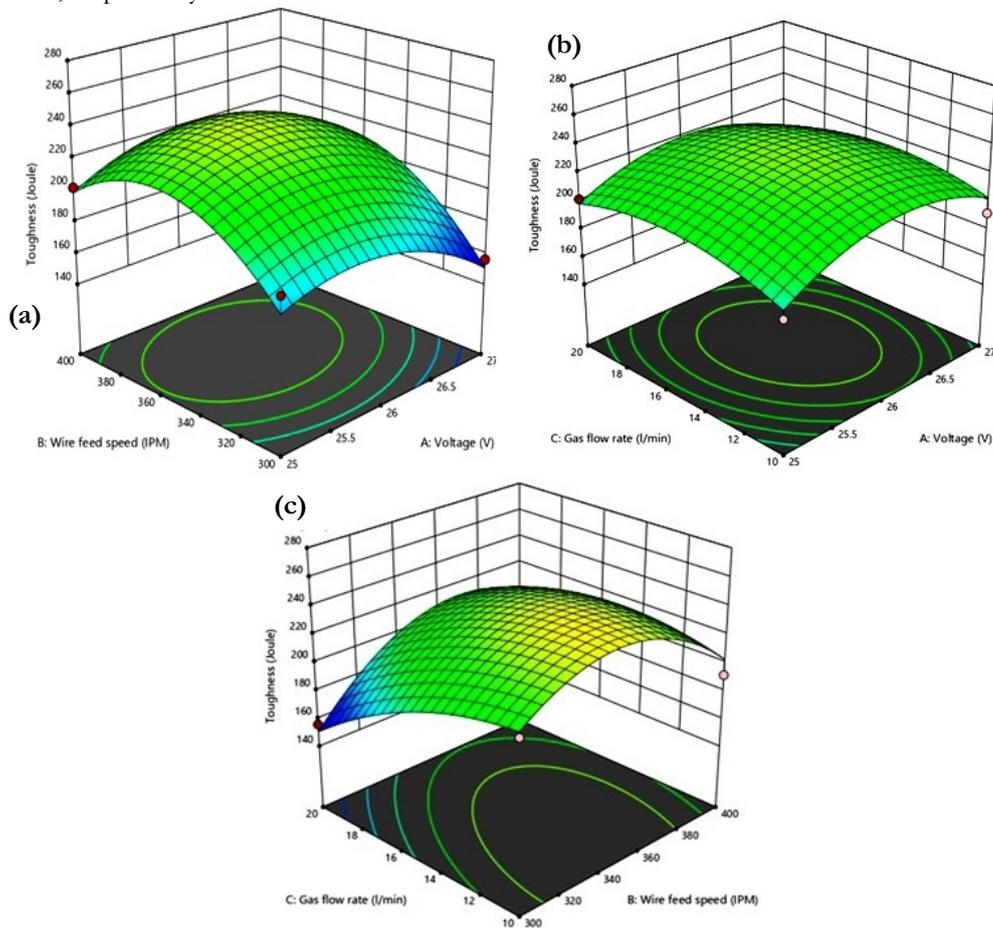


Figure 2: Response surface plot showing the interaction effect of (a) WFS Vs V, (b) GFR Vs V and (c) GFR Vs WFS on toughness.

Effect of welding parameters on mechanical properties (toughness)

From the Tab. 4 it is very clear that quadratic is the best possible fit for toughness. As the main interaction and quadratic factors that contribute significant to toughness include arc voltage (A), gas flow rate (B), wire feed speed (C), arc voltage



and gas flow rate (AB), arc voltage and wire feed speed (AC), gas flow rate and wire feed speed(BC),current (A²),gas flow rate (B²),and wire fed speed (C²).

Model for toughness

Developed mathematical model for toughness is represented by Eq.3

$$Toughness = -14402.13068 + 1066.54705 * A + 4.72138 * B + 5.50615 * C + 0.135000 * A * B - 0.550000 * A * C + 0.063000 * B * C - 21.33451 * A^2 - 0.013059 * B^2 - 0.542253 * C^2 \quad (3)$$

From Fig. 2 (a) and (b) it is very clear that as on increasing the wire feed speed toughness of weldment increases up to 350 IPM after that toughness start to reduce where as on increasing the voltage toughness tends to increases and it is obtained maximum at point 26V after that toughness tends to decreases it is due to increasing in the heat input.

Fig.3 (a) & (b) represent the normal probability curve for toughness and hardness and this plot is used to check the adequacy of model. as all points are in a straight line,it can concluded that model is adequate[16-18].

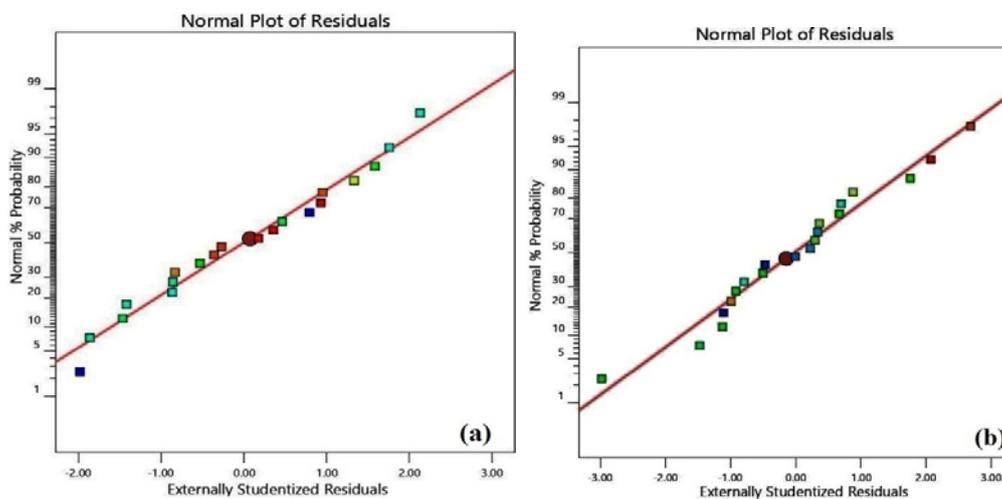


Figure 3: residuals plot for the developed model (a) toughness (b) hardness.

Design expert- 12 version software was used in this experimental work to develop and choose the suggested model that described the response factor in regression analysis and sequential F test was performed to test the significance of the regression model and determine the significant model terms of developed model. Data of Tab. 4 and 5 indicate that a quadratic model is statistically significant for the weldments mechanical quality i.e. toughness and hardness and can be used for further analysis in this investigation.

Source	Sequential p-value	Lack of Fit p-value	Adjusted R ²	Predicted R ²	
Linear	0.5587	0.0002	-0.0476	-0.2908	
2FI	0.7135	0.0001	-0.1650	-1.0345	
Quadratic	< 0.0001	0.0505	0.9088	0.6829	Suggested
Cubic	0.0162	0.8845	0.9746	0.9803	Aliased

Table 4: Statistics model for toughness test

Source	Sum of Squares	df	Mean Square	F-value	p-value	
Mean vs Total	9.496E+05	1	9.496E+05			
Linear vs Mean	3340.00	3	1113.33	0.7125	0.5587	
2FI vs Linear	2409.50	3	803.17	0.4622	0.7135	
Quadratic vs 2FI	21231.24	3	7077.08	52.00	< 0.0001	Suggested
Cubic vs Quadratic	1134.00	4	283.50	7.49	0.0162	Aliased
Residual	227.06	6	37.84			
Total	9.780E+05	20	48897.50			

Table 5: Sequential model sum of square for toughness model.



Analysis of variance (ANOVA)

ANOVA is a power full statically tool to determine which factor influence the response [19]. A model or model term is significant when p value is less than 0.05. In ANOVA p-term represent the probability of importance for each control parameters and higher signifies the use fullness of that parameters. Importance of design or control parameters can be determined and confirmed by ANOVA [20]. Tabs. 6 and 7 shows the ANOVA table for toughness and hardness of weldment. For both cases quadratic model was suggested. For both cases, as the value of R² is closer to 1 hence model is accepted.

Model	26980.75	9	2997.86	22.03	< 0.0001	significant
A-Voltage	202.17	1	202.17	1.49	0.2509	
B-Wire feed speed	41.54	1	41.54	0.3052	0.5928	
C-Gas flow rate	3096.29	1	3096.29	22.75	0.0008	
AB	364.50	1	364.50	2.68	0.1328	
AC	60.50	1	60.50	0.4445	0.5200	
BC	1984.50	1	1984.50	14.58	0.0034	
A ²	6559.46	1	6559.46	48.19	< 0.0001	
B ²	15361.09	1	15361.09	112.86	< 0.0001	
C ²	2648.42	1	2648.42	19.46	0.0013	
Residual	1361.05	10	136.11			
Lack of Fit	1135.05	5	227.01	5.02	0.0505	not significant
Pure Error	226.00	5	45.20			
Cor Total	28341.80					
		Std. Dev.	11.67		R ²	0.9520
		Mean	217.90		Adjusted R ²	0.9088
		C.V. %	5.35		Predicted R ²	0.6829
					Adeq Precision	13.7511

Table 6: ANOVA table for toughness.

Model	3574.75	9	397.19	4.83	0.0108	significant
A-Voltage	568.20	1	568.20	6.91	0.0252	
B-Wire feed speed	146.78	1	146.78	1.79	0.2110	
C-Gas flow rate	12.12	1	12.12	0.1474	0.7090	
AB	0.1250	1	0.1250	0.0015	0.9697	
AC	210.13	1	210.13	2.56	0.1409	
BC	10.13	1	10.13	0.1232	0.7329	
A ²	1204.41	1	1204.41	14.66	0.0033	
B ²	674.99	1	674.99	8.21	0.0168	
C ²	1251.44	1	1251.44	15.23	0.0029	
Residual	821.80	10	82.18			
Lack of Fit	676.47	5	135.29	4.65	0.0584	not significant
Pure Error	145.33	5	29.07			
Cor Total	4396.55					
		Std. Dev.	9.07		R ²	0.8131
		Mean	176.35		Adjusted R ²	0.6449
		C.V. %	5.14		Predicted R ²	-0.2269
					Adeq Precision	6.5677

Table 7: ANOVA table for hardness

Effect of welding parameters on mechanical properties (hardness)

The moderate fit for hardness (VHN) also highlighted the quadratic relation as the possible best fit. From ANOVA table it is clear that as the main interaction and quadratic factors that contribute significant to hardness include arc voltage (A), gas flow rate (B), wire feed speed (C), arc voltage and gas flow rate (AB), arc voltage and wire feed speed (AC), gas flow rate and wire feed speed (BC), current (A²), gas flow rate (B²), and wire fed speed (C²).reduced ANOVA is tabulated in Tab. 7. Developed mathematical model for hardness is represented by Eq.4.

$$HV = +6262.89689 - 454.42813 * A - 2.11433 * B + 13.70422 * C + 0.002500 * A * B - 1.02500 * A * C + 0.004500 * B * C + 9.14189 * A^2 + 0.002738 * B^2 + 0.372747 * C^2 \tag{4}$$

From Fig. 4 (a) and (b) it is very clear that as on increasing the arc voltage there is increment in the hardness of weldment where as on increasing the wire feed speed and gas flow rate there is little increment in the hardness. but from Fig. 4 (c) it is very clear on increasing the amount of gas flow rate hardness of weldment first increases and then decreases.

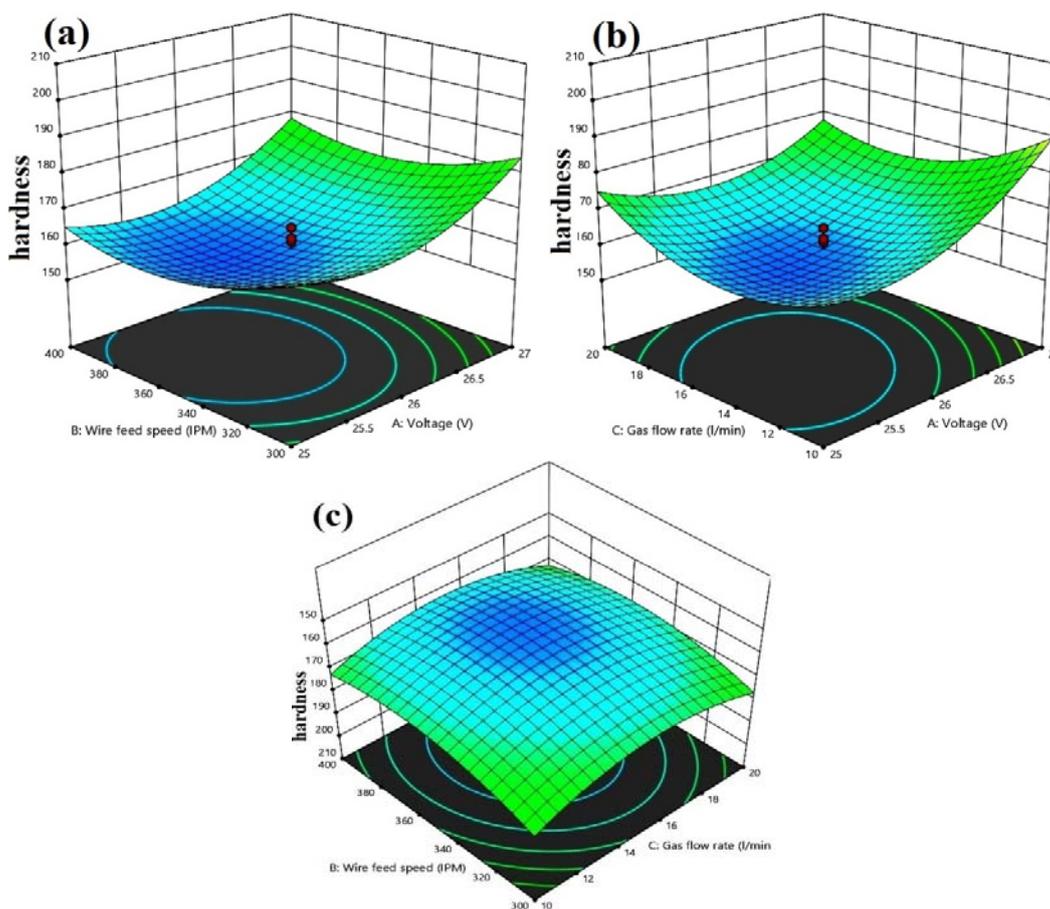


Figure 4: Response surface plot showing the interaction effect of (a) WFS Vs V,(b) GFR Vs and V and (c) GFR Vs WFS on hardness.

Fig. 5 shows the effect of all the three welding process parameters on the weldment hardness at the centre point in the design space.

Fractographic analysis

Toughness test samples of IS 2062 steel weldments were tested for mode of fracture with the support of scanning electron microscope (SEM) to determine the nature of fracture i.e. ductile fracture or brittle fracture and it was observed that from Fig. 6 a- b having quasi-cleavage fracture [21] that consist a river patten and shows a brittle fracture but from Fig. 6 c it is very clear as there are a large number of dimples on fracture surface hence representing a ductile fracture.

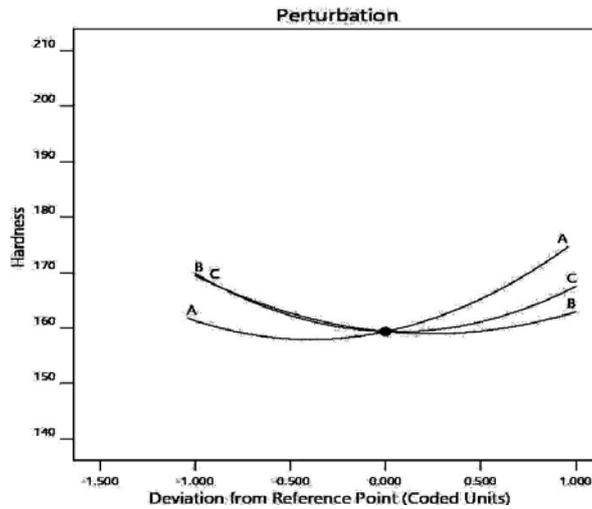


Figure 5: Perturbation plot showing the effect of all factor on the hardness of weldment.

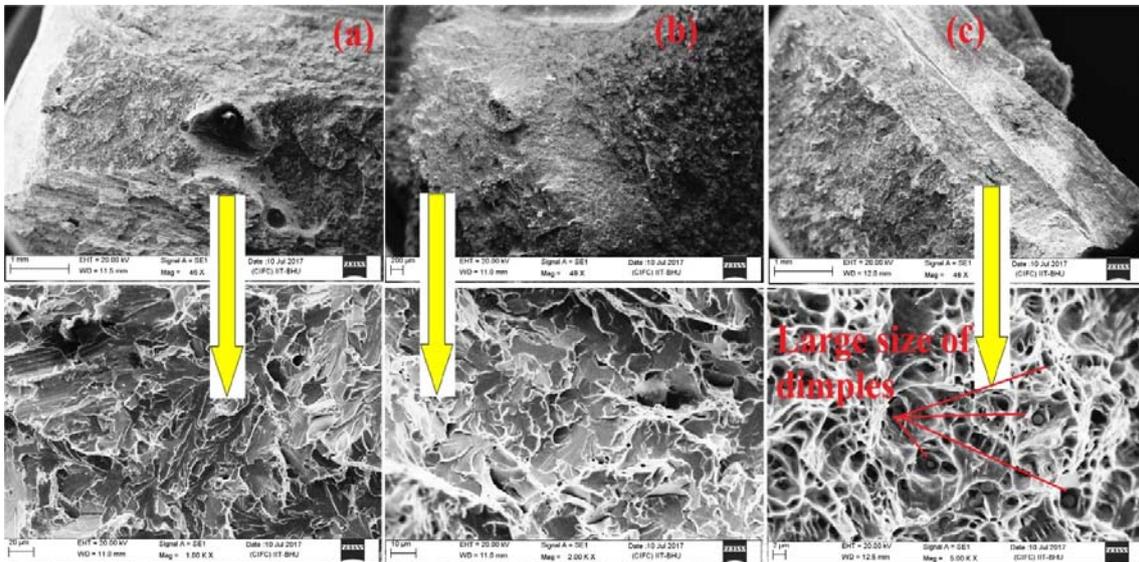


Figure 6: SEM image of fracture surface of samples.

CONCLUSION

This experimental work focuses on the GMA welding of IS 2062 structural steel of grade A. This study was carried out in order to determine the effect of GMA welding process parameters on the mechanical quality of weldments i.e. toughness and hardness. In addition, the interactions between the welding parameters were determined via 3D response plot and a mathematical model was proposed to predict the mechanical behavior of the weldments using response surface methodology (RSM). The following conclusions have achieved.

- Response surface methodology approach can be effectively applied to determine the effect of process parameters on response i.e. on output.
- RSM method is also used to plot the contour graph for various responses to show the interaction between the different process parameters.
- The effective of both models i.e. toughness and hardness was checked according to R^2 terms. As the R^2 value in model is near to unity hence developed model represent good accuracy.
- Ductile fracture was observed on SEM fractography of toughness test samples



- Wire feed speed and arc voltage having the significant effect on toughness and hardness. Gas flow rate is least effective parameters.

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