

# APPLICATION OF TAGUCHI TECHNIQUE TO OPTIMIZE THE GMA WELDING PARAMETERS AND STUDY OF FRACTURE MODE CHARACTERIZATION OF AISI 304H WELDED JOINTS

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This research article is focusing on the optimization of different welding process parameters which affect the weldability of stainless steel (AISI) 304H, Taguchi technique was used to optimize the welding parameters and the fracture mode characterization was studied. A number of experiments have been conducted. L9 orthogonal array (OA) (3×3) was applied. Analysis of variance (ANOVA) and signal to noise ratio (SNR) was applied to determine the effect of different welding parameters such as welding current, wire feed speed and gas flow rate on mechanical, microstructure properties of SS304H. Ultimate tensile strength (UTS), toughness, microhardness (VHN), and mode of fracture was examined to determine weldability of AISI 304H and it was observed from results that welding voltage has major impact whereas gas flow rate has minor impact on ultimate tensile strength of the welded joints. Optimum process parameters were found to be 23 V, 350 IPM travel speed of wire and 15 l/min gas flow rate for tensile strength and mode of fracture was ductile fracture for tensile test specimen.

**Keywords:** GMAW/MIG, mechanical properties, ANOVA, stainless steel, mode of fracture, SEM, weldability

## 1. Introduction

Metal inert gas welding or gas metal arc welding process (MIG/GMAW) is an advanced version of electric arc welding in which no pressure is applied during the welding process and arc is created between a continuous copper coated wire and workpiece [1]. This GMAW is a commonly used method for joining of steel structural components for the automotive industry [2, 3]. AISI 304 or 304L is the modern evolution of the novel “18-8” austenitic stainless steel. This steel is a very inexpensive and versatile anti-corrosion stainless steel, suitable for a broad range of general purpose use. AISI 304H has a higher chromium and lower carbon content. Lower carbon contents reduce chromium carbide precipitation during the process and its susceptibility to intergranular corrosion. AISI 304H is frequently used in various industries such as chemical and petrochemical, processing industries, pressure vessels, tanks, valves and pumps, heat exchangers, piping systems, flanges, fittings, medical, pharmaceutical processing, food, beverage processing and nuclear industries due to its excellent tensile strength, good weldability, and better corrosion resistance properties [4].

Dinesh Mohan Arya et al. [5] investigated process parameters for metal inert gas welding and they reported that welding current is having maximum percentage contribution to experimental work. Nabendu Ghosh et al. [6] optimized the metal inert gas welding parameters, by Grey-based Taguchi technique and they reported in their result that current has a major impact in influencing the tensile strength of welded joint as compared to the gas flow rate.

Doniavi et al. [7] optimized and predicted mechanical properties of St52 with gas metal arc welding by application of RSM and ANOVA technique and they mentioned in their result that the lower the temperature difference between the weld HAZ areas the lower the tensile stress in weld line. The Tensile strength of welded joint increases on increasing the CO<sub>2</sub> gas percentage in shielding gas and maximum error between predicted and experimental values for tensile strength observed 0.44%. Abhishek Prakash et al. [8] determined the (welding) process parameters which influence the mechanical properties by applying the Taguchi method and they produced a result that welding current has the greatest influence on tensile strength and hardness in the weldability of weld-

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ed joint followed by wire feed speed and arc voltage. Bayazida et al. [9] predicted welding variables like travel speed, rotational speed and position of plates on mechanical and microstructural properties of friction stir welded joint of two dissimilar aluminum alloys, i.e. AA6063 and AA7075 with Taguchi technique and they reported that rotational speed, travel speed, and plates position have 59, 30, and 7% influence on tensile strength of welded joint, respectively.

Saurav Datta et al. [10] developed a multi-response problem to optimize parameters by combining to yield favorable bead geometry of submerged arc welding bead on-plate weldment and they coupled the Taguchi optimization method with Grey relation technique to evaluate the optimal parametric combination for deeper penetration, minimum bead height and depth HAZ of welded part.

Kalita and Barua [11] investigated the effect of the process parameters of metal inert gas welding such as welding current, arc voltage and shielding gas flow rate on tensile strength of welded joints by the Taguchi optimization method and they concluded that welding voltage has significant effect, both on mean and variation of the tensile strength of the weld having 87.019% and 85.398% contribution, respectively, whereas welding current has significant effect on mean only (10.807% contribution) whereas shielding gas flow rate has insignificant effect on the tensile strength of the welded joint.

Therefore in this research article, an attempt has to be made to optimize the process parameters of metal inert gas (MIG) welding. Chikhale et al. [13] predicted the mechanical performance of AA 6061-T6 by metal inert gas welding and they consider the welding current, arc voltage and wire feed speed as welding parameters and finally they optimized the parameters by reporting that welding current has principal impact on the Tensile strength, depth of penetration and toughness of weld joint. Rizvi et al. [14] optimized different welding process parameters by application of Taguchi technique on MIG welding during bonding of IS2062 steel and they mentioned in their outcome that welding voltage and welding current have major impact on tensile strength of welded joint whereas gas flow rate has least significant effect on tensile strength of the welding. Liu et al. [16] investigate the tensile behaviour and fracture characteristics of SS clad plate by vacuum rolling and they observed that tensile ductility increases with increasing rolling temperature. Ramesh Kumar Buddu et al. [17] investigate mechanical properties, microstructure and fracture morphology of SS304L plate welded by laser welding and they find in their result that tensile fracture has revealed ductile fracture mode with fine dimples and impact fracture test having lower value for weld zone, heat affected zone

(HAZ) as compared to base metal. Hasanzadeh et al. [18] investigated the Mechanical properties of polycarbonate friction stir welded samples with different nanoalumina content. Taguchi method was employed to determine the effect of welding parameters and they demonstrated in their result that the weight percentage of nanoalumina is the most effective parameter on the tensile strength and hardness of welded nanocomposite samples.

Choudhary and Duhan [19] determined the effect of flux on properties of SS 304 using TIG welding on ultimate tensile strength, percentage elongation, Penetration depth, width and depth to width ratio and from experimental result it was found that under the same welding condition, the  $MnO_2$  and  $Fe_2O_3$  fluxes can produce the greatest improvement in penetration capability, up to 2-3 times.

Rizvi and Tewari [20] determined the effect of different welding parameters on mechanical properties and microstructure of SS 304H welded joint with MIG welding process and it was reported that on changing the gas flow rate and wire feed speed, microstructure and mechanical properties of weldment changed. Impact tests reveal that toughness of the welded joint increases with increasing in welding current, while ultimate tensile strength (UTS) first increases and then decreases Singh et al. [21] applied Taguchi technique to determine the effect of friction stir welding (FSW) on tensile properties of AA6063 under different welding conditions and authors observed from their result that tensile strength of AA6063 welded joint increases with increasing the rotational speed and reduces with increasing transverse feed. Rizvi and Tewari [22] coupled Taguchi technique with grey relational analysis to optimize the process parameter during the welding of SS304 by MIG welding. It was observed that wire feed speed had most significant effect followed by voltage and gas flow rate. Shanti Lal Meena et al. [23] investigated the metallurgical and microhardness across the various zones of the welding in synergic MIG of SS304 and it was observed that pearlite content and the range of size distribution for the base metal and the weld zone are almost the same. While the pearlite content for the HAZ is higher and the numbers of grains is greater, the increased pearlite content combined with finer microstructure results in greater micro hardness in the HAZ. Also, it can be observed that the microhardness is greatest in the grain refined region.

## 2. Design and experimental work

### 2.1. Workpiece material

In this research article stainless steel (AISI) 304H was used as raw material. The AISI 304H plate of dimen-

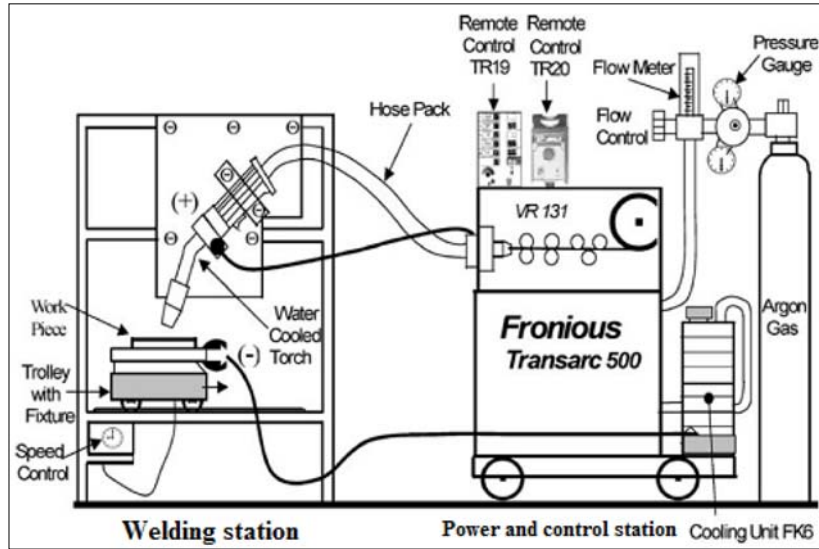


Fig. 1. Schematic diagram of GMA welding setup [15]

sion 150 mm × 60 mm × 5 mm were bonded by using gas metal arc welding (GMAW) machine with Polarity direct current electrode negative (DCEN). A schematic diagram of set of the GMAW is shown in Fig. 1.

After completed weld, welded plates were machined on the horizontal milling machine for generating V-groove. The chemical composition of parent metal plate AISI 304H and filler rod used in the process for welding purpose are given in Table 1, respectively.

In recent years, other intelligent algorithms technique such as artificial neural networks (ANN) [26, 27], genetic algorithm (GA) [28] and particle swarm optimization (PSO) [29] have become popular in determining and optimizing of weld quality. But for this work, Taguchi method was selected for optimization of process parameters. Taguchi design of the experiment is a simple and fool proof approach, which is used to reduce the analysis up

to an optimal level. In this research article, three factors were selected with their levels as shown in Table 2, selection of the orthogonal array was based on DOF. The degree of freedom for all three factors is 6 in this design and welded by GMAW process with different welding parameters, nine tensile test specimens were cut from welded piece longitudinally; vertical milling machine is used to produce an arc of  $R = 12.5$  mm and to produce “V” notch in charpy impact test specimens. Tensile test specimens are prepared as per American Society of Testing of Materials (ASTM) standard and a standard tensile test sample is shown in Fig. 2.

All tensile test specimens are tested on UTM-40 T at room temperature. Tensile test specimens after fracture are shown in Fig. 3. Three different welding parameters are used to perform the welding. In entire, this research work pure argon (Ar) was used as shielding gas to avoid any contamination of weld pool, as pure argon has special characteristics.

Table 1. Composition of parent metal and filler wire

Material	C (%)	Cr (%)	Ni (%)	Mn (%)	Si (%)	P (%)	S (%)	Cu	Fe
Base plate	0.06	18.68	8.54	1.9	0.41	0.031	0.005	- rest	
Filler wire	0.08	19.5–22.0	9.0–11.0	1.0–2.5	0.3–0.65	0.030	0.03	0.75 rest	

Table 2. Input (welding) parameters with their level

Variable	Level I	Level II	Level III
Voltage (V)	21	22	23
Gas flow rate (l/min)	10	15	20
Wire feed rate (IPM)	300	350	400

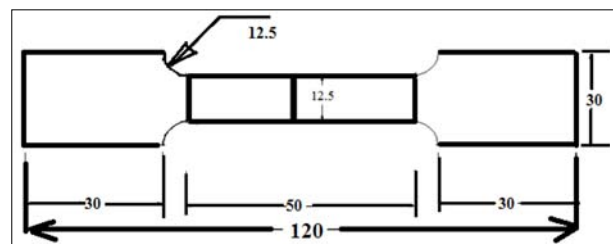


Fig. 2. Tensile test specimen as per ASTM [12]

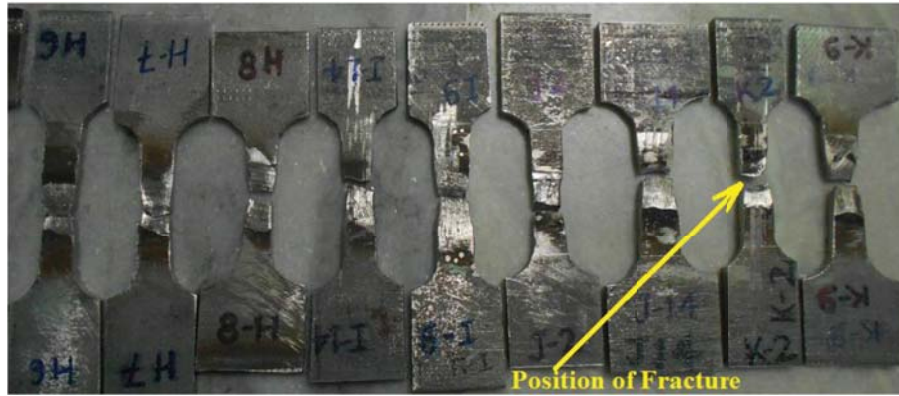


Fig. 3. Tensile test specimen after fracture

Table 3. Result for tensile strength hardness and impact toughness

Experiment No.	Voltage	Gas flow rate	Wire feed speed	UTS	SNRA1	Micro-hardness	SNRA2	Impact strength	SNRA3
1	21	10	300	540	54.6479	171	44.6599	170	44.6090
2	21	15	350	610	55.7066	183	45.2490	234	47.3843
3	21	20	400	446	52.9867	200	46.0206	210	46.4444
4	22	10	350	574	55.1782	233	47.3471	222	46.9271
5	22	15	400	571	55.1327	210	46.4444	142	43.0458
6	22	20	300	491	53.8216	187	45.4368	184	45.2964
7	23	12	400	596	55.5049	205	46.2351	216	46.6891
8	23	15	300	620	55.8478	176	44.9103	160	44.0824
9	23	20	350	569	55.1022	216	46.6891	196	45.8451

## 2.2. Welding parameters

In this research article, parameters which were used in welding operation are listed in Table 2.

In the present research, an L9 OA with 3 columns and 3 rows were used. This array can handle three level process parameters. Nine experiments conducted to study the welding parameters using the L9 OA. OA and the corresponding values of welding parameters are listed in Table 3.

## 3. Results

### 3.1. Evaluating the signal-to-noise (S/N) ratios

Noise factors are those uncontrollable factors which affect the process result (output), whereas derived response is known as signal. The variation of index is known as S/N ratio. Variations are usually of three types, i.e. “lower is better”, “higher is better” and “normal is better”. In the present experimental work UTS, microhardness, toughness (impact strength) were output (weld quality). For good quality of weld hardness, impact strength and UTS were considered as “higher is better”. In order to evaluate the influence of each

selected factor on the responses, S/N ratios for each control factor were calculated.

In the present research work, tensile strength, microhardness and impact strength of welded pieces were acknowledged as the responses, hence, “higher the better” were considered for ultimate tensile strength and “nominal the best” for hardness properties for analysis purpose.

$$S/N = -10 \log_{10} \left( \sum_{i=0}^n y_i^{-2} \right) \quad (1)$$

Higher is better

$$S/N = -10 \log_{10} \left( n^{-1} \sum_{i=0}^n y_i^2 \right) \quad (2)$$

Lower is better

$$S/N = -10 \log_{10} \left( n^{-1} \sum_{i=0}^n (y_i - m)^2 \right) \quad (3)$$

Normal is better

For tensile strength response table or signal to noise ratio are shown in Table 4.

**Table 4.** Response table for signal to noise ratios

Level	Voltage	Gas flow rate	Wire feed speed
1	54.45	55.11	54.77
2	54.71	55.56	55.33
3	55.49	53.97	54.54
Delta	1.04	1.59	0.79
Rank	2	1	3

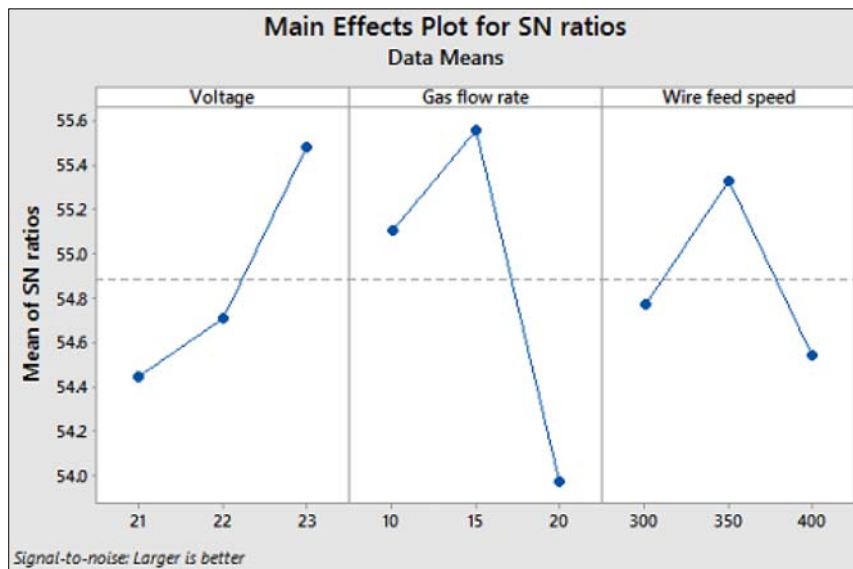
3.1.1. Tensile strength

Ultimate tensile strength (UTS) was calculated experimentally, Taguchi technique was applied to analyze

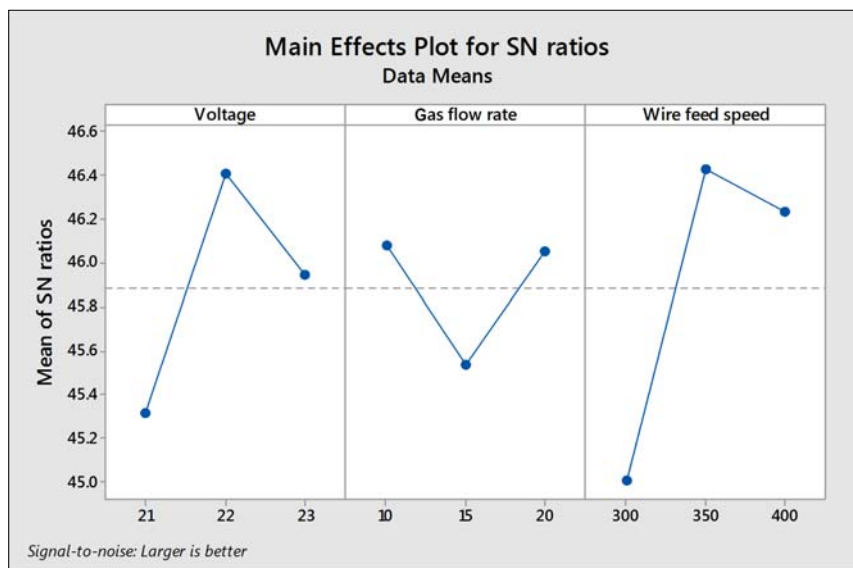
with support of ANOVA and mode of fracture was studied. On the basis of data analyzed, plots for S/N ratio are shown in Fig. 4. It is very clear from Fig. 4 that third level of voltage (23 V), the second level of gas flow rate (15 l/min) and second level of wire feed speed (350 IPM) produce higher tensile strength.

3.1.2. Hardness

Vicker hardness (VHN) of test samples were also experimentally calculated, Taguchi method was employed to find out the optimal welding process parameters with support of ANOVA. On the basis of data summarized, plots for S/N ratio are expressed in Fig. 5. From Fig. 5 it is observed that voltage (22 V),



**Fig. 4.** Main effects plot for S/N ratios (UTS)



**Fig. 5.** Main effects plot for S/N ratios (VHN)

**Table 5.** Analysis of variance for SNRA1 (UTS) using adjusted SS for tests

Source	DF	Adj. SS	Adj. MS	F	P	Contribution (%)
Arc voltage	2	6613.6	3306.8	11.58	0.079	25.5
Gas flow rate	2	15213.6	7606.8	26.65	0.036	58.7
Wire feed speed	2	3494.2	1747.1	6.12	0.140	13.5
Error	1	570.9	285.4			2.2
Total	8	25892.2				

**Table 6.** Analysis of variance for SNRA2 (hardness) using adjusted SS for tests

Source/ parameters	DF	Adj. SS	Adj. MS	F	P	Contribution (%)
Arc voltage	2	968.2	484.11	4.88	0.170	25
Gas Flow rate	3	310.2	155.11	1.57	0.390	58
Wire feed speed	2	1828.2	914.11	9.22	0.0985	14
Error	1	198.2	99.11			3
Total	8	3304.9				

first level of gas flow rate (10 l/min) and second level of wire feed speed (350 IPM) give normal values of hardness.

### 3.2. ANOVA

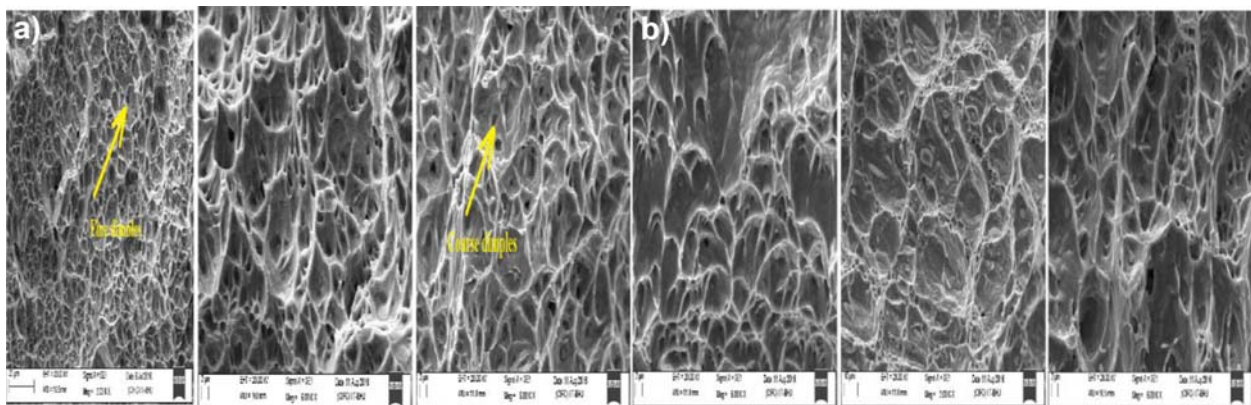
Analysis of variance (ANOVA) is a statistic tool or technique, which is applied to evaluate the differences between the mean and their associated procedure. ANOVA results for UTS given in Table 5 show that gas flow rate has the major principal effect with 59% contribution followed by arc voltage with 25% contribution, while wire feed speed has the least effect.

ANOVA for S/N ratio for hardness is summarized in Table 6 and it is very clear from the table that gas flow rate has the major significant impact with 58% contribution followed by arc voltage with 25% contribution, while wire feed speed has the least effect.

## 4. Mode of fracture

### 4.1. Fracture mode of the tensile test specimen

Fracture mode of tensile test specimens was studied by SEM apparatus at room temperature. The fracture surface of AISI 304H welded joint obtained with MIG welding are shown in Fig. 6. Mode of fracture of the tensile test specimens was tried to be understood by the given figure. Figure 6b shows the fractographs of tensile fractured surface. It is very clear from figure that mode of fracture was ductile with numerous dimples. It is also observed from the result that format of fracture is not uniform; cleavage fracture is a tear type fracture. Cleavage and secondary cleavage are clearly visible in SEM image of fracture surface and in another study it was found that impact toughness was reversely correlated with the square root of dimple size [25].



**Fig. 6.** Fractograph morphology (SEM) of tensile test specimens



Fig. 7. Impact test samples after fracture

#### 4.2. Fracture mode of toughness test specimen

To determine the toughness “V” notch Charpy samples were prepared as per ASTM. Specimens after fracture are shown in Fig. 7. Impact fractured specimens were examined to determine the surface morphology.

Figure 8 shows the images of fractograph of impact Charpy “V” notch test piece. Sample 1 in Fig. 8

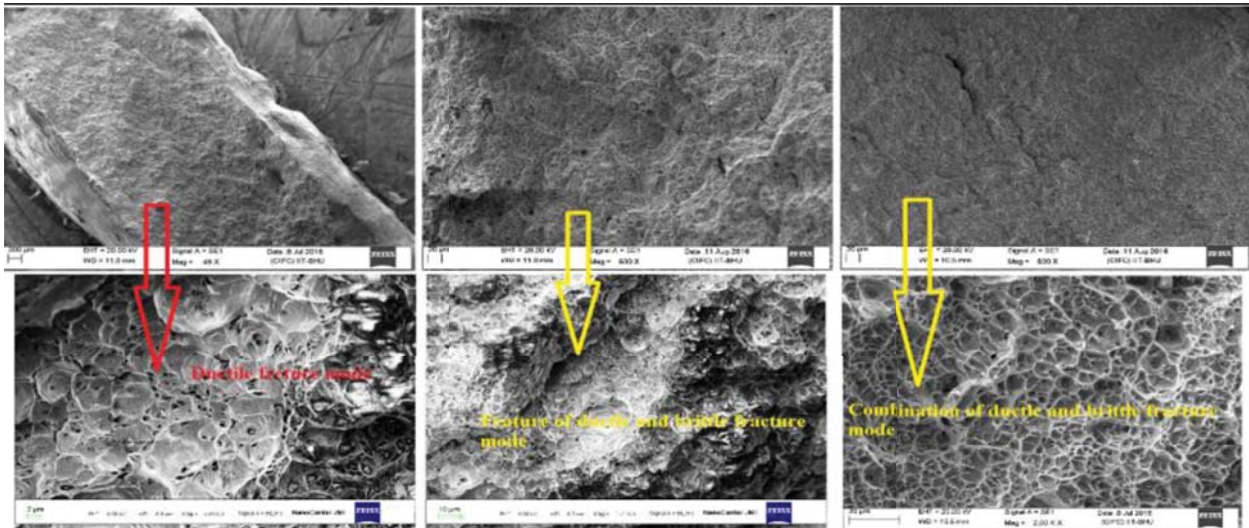


Fig. 8. Macro images and SEM images of impact fracture samples for morphology

shows the ductile fracture with coarse dimples. Enough finer dimples are observed in sample 3 in Fig. 8. Combined ductile and brittle fracture mode formation is responsible for poorly absorbed energy. Cracks initiated at soft ferrite and then triggered brittle fracture at the

interface between ferrite and martensite, while ductile fracture at the interface between ferrite and austenite [24] sample 2 showed shallow dimples.

## 5. Conclusions

In the present research work, the effect of gas metal arc welding (GMAW) processes on various welding variables and fracture mode characterization was studied. The welding process parameters in this experiment were: arc voltage, wire feed speed, and gas flow rate. It was found that:

- The process parameters for MIG welding of stainless steel (SS) with the optimal weldability have been marked.
- The modified Taguchi technique was applied to determine the optimal weldability with three higher-the-better quality characteristics
- The analysis showed that gas flow rate having the significant parameter that affects the UTS and VHN is followed by arc voltage and wire feed speed
- Ductile fracture mode was observed with fine dimples for tensile test samples,
- SEM analysis of fractured test pieces, fracture morphology showed rough dimples with the combination of ductile and brittle fracture in impact toughness welding samples
- All Charpy “V” notch test samples broke from the centre line.

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