Towards optimization of thickness, hardness, and porosity of low-pressure cold sprayed WC-Ni coatings

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Abstract
In this study, a $3^3$ full factorial design methodology was used to analyze the effects of spray parameters on the thickness, hardness, and surface porosity of low-pressure cold-sprayed WC-17Ni coatings. Three levels were selected for the spray parameters included in the design which were the powder feed rate (17.1 g/min, 21.1 g/min, and 23.7 g/min), gas temperature (475°C, 500°C, and 525°C), and the nozzle to substrate stand-off distance (3 mm, 5 mm, and 10 mm). It was found that the feed rate was the most significant parameter that affected the coating thickness. The surface porosity was most significantly affected by stand-off distance. The coating hardness was most influenced by the interaction between the feed rate and stand-off distance. An optimization study was then performed to maximize the coating thickness and hardness while minimizing the surface porosity. The optimal spray parameters (OSP) were found to be at a feed rate of 23.7 g/min, 500°C for the carrier gas temperature, and 10 mm for the stand-off distance. The OSP yielded a coating that was 1.22 ± 0.06 mm thick, with a hardness of 364.5 ± 8.5 HV and porosity of 6.8 ± 0.6%. With a multi-parameter process, the system response is affected by both the variation in the individual parameters and the interaction of the parameters with each other. It was also concluded that the interaction between the parameters significantly affected the coating hardness. These results suggest that variation of the selected parameters produce statistically significant effects on the coating quality of WC-17Ni coatings using a low-pressure cold spray system.

Keywords Cold spray · Coatings · Factorial design · Nickel · Optimization · Tungsten carbide

1 Introduction

1.1 Thermally sprayed WC-based MMC coatings
Metal matrix composite (MMC) coatings reinforced with tungsten carbide (WC) are widely used in industry due to their enhanced wear resistance and hardness [1–3]. Thermally sprayed WC-based MMC coatings are often preferred for repair jobs as it is more feasible to coat prepared parts rather than preparing and machining bulk WC. Due to their improved wear and hardness properties, WC-Ni coatings are useful for surface protection and repair in aggressive wear environments. WC-Ni coatings are currently being used for surface protection and repair in pipelines, aircraft engines, and steam and jet engines to mitigate erosion due to particle impingement [2, 3]. The most typical method of depositing WC-based MMC coatings is with high temperature high-velocity oxy-fuel (HVOF) spraying. HVOF-sprayed WC coatings are used for various surface modification applications [4–18]. However, using high-temperature deposition methods often lead to undesirable metallurgical changes [9], phase transformations [9], and residual stresses [11] in the coatings. The most common problem in WC-based MMC coatings fabricated using high-temperature deposition methods is decarburization [6, 17, 19, 20]. Studies have shown that decarburization in WC-based MMC coatings introduces brittle phases, which negatively affect the abrasion resistance of the coatings [8–10].

In order to mitigate problems such as decarburization and phase changes induced by high temperature deposition methods, other forms of thermal spraying have been considered. A method known as warm spraying, where nitrogen is mixed with the flame during HVOF to lower the temperature of the flame, has been used to create WC-based MMC
coatings which have shown to have reduced decarburization and comparable mechanical properties as HVOF-sprayed coatings [6, 21]. In order to eliminate decarburization completely, a thermal spraying method called cold gas dynamic spraying or cold spraying has been employed. Cold spraying is a solid-state deposition process that is used to fabricate dense and thick MMC coatings. The deposition is carried out by accelerating powdered metal or ceramic particles (1 to 45 μm in size) at high velocities (500-1500 m/s) using a carrier gas. As the name implies, cold spraying is performed at low temperatures, which ensures that decarburization does not occur. The carrier gas is maintained at temperatures lower than the melting point of the feedstock material, which also eliminates undesirable metallurgical changes induced during melting [22]. The particles attain high kinetic energy as they go through a de Laval nozzle which leads to severe plastic deformation of the powder particles upon impact on the substrate. The deposition occurs as particles flatten due to particle-substrate or particle-particle impacts, thereby creating successive layers of mechanically interlocking particles, which creates the coating [22–25]. The effect of spray parameters (e.g., feed rate, gas temperature and stand-off distance) involved in cold spraying on the coating is explored in this study.

Several researchers have used high-pressure (~2 to 4 MPa) cold spraying to fabricate WC-based MMC coatings [26, 27]. The coatings produced using high-pressure cold sprayed showed no evidence of decarburization [28]. The challenge faced using high-pressure cold spraying was achieving sufficiently thick coatings. In one study, Gao, et al. [27] found that it was difficult to induce plastic deformation of WC-Co particles on previously deposited particles, which led to fabrication of thin coatings. Some researchers were able to create thick WC-based MMC coatings by pre-heating the feedstock powder [29]. This study explores the effect of spray parameters on the coating thickness achieved during a cold spray process.

Even though several studies have been performed on high-pressure cold sprayed WC-based MMC coatings, the studies performed are very limited for low-pressure cold sprayed WC-based MMC coatings. Some researchers have used low-pressure cold spraying to fabricate thick WC-based MMC coatings from ceramic powders admixed with a soft metal binder phase [30]. For example, Wang and Villafuerte deposited WC-Cu coatings using low-pressure cold spray, which yielded a hardness of ~200 HB [31]. In another paper, Melendez and McDonald fabricated WC-Ni coatings using low-pressure cold spray to produce coatings with hardness as high as 530 HV0.3 [30]. No evidence of decarburization was found in the coatings created using low-pressure cold spraying. Although several studies have been conducted to produce thick, hard and dense WC-based coatings [8, 30, 32–34], very limited work exists that explores the optimization of these properties; which is the main focus of this study.

1.2 Optimization methods for MMC coatings

For any manufacturing processes, it is critical in modern, competitive industry that the manufacturing process is optimized. Most manufacturing processes involve process parameters that have an effect on one or more response characteristics. For example, surface modification processes such as friction stir welding involves several operation parameters that can have significant effect on the quality of the weld [35, 36]. Therefore, simultaneous optimization of response characteristics is of immense importance to make the process as efficient as possible. Like other manufacturing processes, cold spraying is also a multi-parameter and multi-response process. Therefore, the process or operation parameters involved in a cold spray process, including, but not limited to, gas pressure, temperature, stand-off distance, feed rate, powder morphology, substrate roughness, and substrate temperature can all have an effect on various characteristics of the coating [32–34, 37–42]. Physical defects such as porosity can dominate the mechanical performance of materials leading to premature failure [43, 44]. Since cold spray coatings are often used for geometric and functional repairs, achieving desired characteristics, including coating thickness, hardness, density, and porosity is important. Therefore, optimization of process parameters is an essential part of any spray process.

Some researchers have explored optimization methods for various thermal spraying processes [45–48] such as plasma spraying and HVOF spraying. Since optimization is a crucial part of any production process, optimization methods are widely studied and they typically employ experimental methods [41, 49–53], numerical analyses [32–34, 42, 46–48, 54–57], or use artificial intelligence approaches [43]. In one study, Sarikaya [48] conducted an experimental optimization study for HVOF sprayed alumina coatings to analyze the effect of stand-off distance, substrate temperature, and surface roughness on the coating hardness, thickness, and porosity. Since this study was experimental, the effects of only a single process parameter were analyzed at a time, thereby disregarding the possible coupled relationship of those parameters. They concluded that increasing the substrate temperature enhanced the coating hardness, porosity and surface roughness. In another study, a real-time optimization method was employed by Liu, et al. [43] using artificial neural networks to achieve a desired coating porosity by changing the gas flow rates and current intensity in a plasma spraying process. Using experimental data, an artificial neural network framework was used to predict the coating porosity based on a given set of input parameters through machine learning. This enabled real-time, in situ optimization during a plasma spray process [43]. In a separate approach, Hong, et al. [44, 54] employed the Taguchi statistical method to understand and optimize the response of WC-Co coatings and iron-alloy coatings deposited using HVOF spraying. The effect of stand-off
distance and oxygen and kerosene flow rates on the hardness of WC-Co coatings and the porosity of iron alloy coatings was analyzed [44]. They found that the kerosene flowrate had the greatest effect on the hardness of WC-Co coatings and porosity of the iron alloy coatings. It has also been found that stand-off distance, nozzle temperature and feed rate have greater impact on the coating density, thickness and surface roughness compared to other spray parameters for example traverse speed and substrate temperature [40–42]. This study explores the effects of feed rate, gas temperature and stand-off distance on the coating thickness, hardness, and surface porosity.

Although several studies have been performed on optimizing HVOF and plasma spraying processes, there are fewer studies investigating parameter optimization for cold spray processes. Some of the existing work includes an experimental investigation conducted by Magaro, et al. [41] to investigate the effect of gas temperature, gas pressure, and nozzle traverse speed on the coating hardness and elastic modulus for Stellite 6 coatings deposited using a high-pressure cold spray process. It was found that reducing the traverse speed improves the coating hardness and elastic modulus [41]. Since cold spray processes involve several process parameters that may affect various coating characteristics (e.g., thickness, hardness, porosity), investigating these effects simultaneously becomes challenging using experimental methods alone as the required number of depositions increases exponentially with increasing parameters. Therefore, experimental studies alone tend to be very limited in the number of parameters and response characteristics investigated.

In their investigations, Goyal, et al. [45–47] conducted several studies to optimize the surface roughness, coating thickness, and density for low-pressure cold sprayed copper coatings using the Taguchi method. The process parameters analyzed in these studies were substrate material, gas pressure and temperature, and stand-off distance. It was concluded that the surface roughness was most affected by gas pressure, the coating thickness by stand-off distance, and coating density by substrate material [45–47]. The Taguchi method is designed to only investigate the effect of process parameters on one response characteristic. Therefore, the Taguchi method is limited to single response assemblies and is incapable of handling multi-response systems. To simultaneously analyze multiple responses, researchers often use factorial designs. For example, Villa, et al. [39] employed a $3^2$ fractional factorial design to optimize the density, porosity, and hardness of cold-sprayed steel coatings based on process gas temperature and pressure. It was concluded that coatings deposited at higher temperature and pressures yielded enhanced hardness, density and porosity [39]. Similarly, Hasniyati, et al. [37] conducted a $2^{4+1}$ fractional factorial study to optimize the coating hardness, thickness, and elastic modulus of cold sprayed hydroxyapatite coatings as functions of stand-off distance, substrate temperature, and surface roughness.

Although statistical methods like Taguchi and fractional factorial designs have been explored by several researchers to optimize cold spray processes, there is limited work for statistical optimization of WC-based MMC coatings deposited using cold spray processes for larger experimental spaces. Therefore, there is limited research about simultaneous optimization of 3 or more process parameters and their effect on several different response characteristics. As the experimental space increases with the increase of process parameters and response characteristics that are analyzed, the number of experiments required to achieve statistically significant results increases exponentially [58]. Building on these past works and concepts, the objectives of this study are to analyze the effects of spray parameters on the hardness, thickness, and surface porosity of low-pressure cold sprayed WC-Ni coatings using a $3^3$ full factorial design and Analysis of Variance (ANOVA) approach. Once relationships are established, including coupled effects, the model is used to optimize the coating design.

## 2 Experimental procedure
### 2.1 Materials and cold spray procedure

Low carbon steel was used as the substrate in this study. The substrates were 0.5 mm thick and were cut to a size of 4 cm by 2 cm. The substrates were grit blasted using #24 alumina grit to roughen the surface and improve coating adhesion (Manus Abrasive Systems Inc., Edmonton, AB, Canada). The coating material was a mechanically mixed blend of Ni (N5001, Centerline Ltd., Windsor, ON, Canada), which was the metal matrix, and WC (Oerlikon Metco, Westbury NY, USA), which was the hard, reinforcing phase. The powders were weighed and mixed manually to achieve the desired composition for the powder blend of 83 wt.% WC and 17 wt.% Ni. The size distribution of the as-received Ni and WC powders was 5 to 45 µm, as provided by the manufacturer. The powder morphology for both feedstock powders is shown in Fig. 1. As observed in Fig. 1, Ni particles appear to be dendritic in structure and the WC particles appear to be angular with sharper edges.

The coating deposition was carried out using a low-pressure cold spray nozzle (SST SeriesP, Centerline Ltd., Windsor, ON, Canada) that was manipulated by a fixed robot assembly (HP-20, Motoman, Yaskawa Electric Corp., Waukegan, IL, USA), as illustrated in Fig. 2. To analyze the effect of the spray parameters on the coatings, three controllable parameters were selected: stand-off distance, feed rate, and temperature. These three parameters were selected due to the significant effect that they have on the deposited coating and ease of controlling and varying the input. Temperature and feed rate were both controlled digitally using the interface.
on the cold spray system while the stand-off distance was changed consistently using the robot control system. All other spray parameters such as air pressure (634 kPa), nozzle traverse speed (5 mm/s) and the number of passes (2) were kept constant during the experiments. The experimental parameters used in the study are presented in Table 1. The feed rate is denoted as A, gas temperature as B and stand-off distance as C.

2.2 Factorial design approach

A $3^3$ full factorial design was used to determine which spray parameters most significantly affected the coating thickness, hardness, and surface porosity. The process was also designed to eliminate any parameters that had insignificant impact for future optimization studies. This design of experiments study was conducted using a statistical software (Minitab 19, Minitab Inc, Pennsylvania, USA). Three levels were selected for each spray parameter and were denoted as 1 (low), 2 (medium), and 3 (high) as shown in Table 1. The levels for the parameters were selected based on preliminary experiments which determined the operational limits of the experimental equipment while achieving viable coatings. For a $3^3$ full factorial design, 27 unique design generators or parameter combinations were produced by the Minitab software. Analysis of variance (ANOVA) was used to determine the percent contribution of each of the parameters on the system response. Additionally, since a full factorial design was conducted, the contribution of the interaction between the spray parameters was also determined through ANOVA. Optimization analysis was performed to determine the optimal spray parameters (OSP) which would maximize the coating thickness and hardness and minimize surface porosity.

| Parameter         | Level 1 | Level 2 | Level 3 |
|-------------------|---------|---------|---------|
| A: Feed Rate [g/min] | 17.1    | 21.1    | 23.7    |
| B: Temperature [°C]  | 475     | 500     | 525     |
| C: Stand-off Distance [mm] | 3       | 5       | 10      |
2.3 Coating microstructural characterization

The microstructure of the coatings was observed using a scanning electron microscope (Zeiss Sigma, Jena, Germany). The cross-sectional SEM images were taken at various locations in the coating using magnifications of 150 to 2000× and at a working piece distance of 8.4 mm.

2.4 Thickness, hardness, and surface porosity measurements

The coating thickness was measured using the SEM images and digital calipers with a resolution of 0.01 mm. The coating thickness was taken as the measurement from the top surface of the coating to the surface of the substrate. A minimum of 5 thickness measurements were taken at various points for each coating sample to ensure repeatability in the results.

Coating hardness was measured using a microhardness testing machine (Buehler VH1202, Lake Bluff, Illinois, USA) (Fig. 3) in accordance with the ASTM E384-11 standard. All the coating samples were ground using 240, 360, 400 grit silicone carbide paper (LECO, Mississauga, ON, Canada) to achieve a uniform, flat surface. A load of 1 kgf with dwell time of 10 s was used for the hardness testing with a minimum of 5 measurements for each coating sample.

The surface porosity of the coatings was measured using image analysis and thermal imaging. An image processing software (Image J, Maryland, USA) was used to analyze the cross-section and surface images of the coating to measure the porosity in the coating and at its surface. The as-sprayed coating samples were heated to 125°C for 5 min to generate a temperature distribution in the samples. The heated samples were then imaged using a thermal camera (FLIR x8503sc, FLIR Systems, Wilsonville, OR, USA) as illustrated in Fig. 4. The porosity appeared as spherical defects on the coating surface as they appeared as areas of elevated temperatures as shown in Fig. 5. The images were cropped to a constant area of 100 by 100 pixels and were converted to grayscale using the ImageJ software. Thresholding was applied to segment the grayscale images and quantify the surface porosity of the coating samples as illustrated in Fig. 5. The minimum size to quantify porosity was selected as 4 pixels.

3 Results and discussion

3.1 Coating microstructure

Figure 6 shows the polished cross-sectional microstructure of the cold-sprayed WC-Ni coating deposited using the optimal spraying parameters. As observed in the image, the interface between the coating and substrate does not contain any porosity and is well-adhered to the substrate material. Good adhesion and dense coatings can be attributed to the nature of the cold spray procedure as it is well documented for producing very dense coatings [33]. There appears to be good retention of WC in the coating; however, the WC phase seems to be distributed non-homogeneously, which can lead to varying hardness at different locations in the coating. Similar morphology has been found by other researchers for cold-sprayed WC-Ni coatings [33, 59].

The porosity of the coating deposited using the OSP was quantified using image processing by analyzing a minimum of 4 different SEM images taken from the coating cross section. It was found that the average cross-sectional porosity of the coating was 0.98 ± 0.14%, which is significantly smaller than the surface porosity of 6.8 ± 0.6% for the OSP coating sample. The porosity measurement for the OSP coating is lower compared to the other coatings as illustrated in Fig. 7. During the spray process, as the feed rate of the powder increases, the hard particles often rebound from the coating surface leaving surface defects that contribute to the higher surface porosity. A similar trend was found by Melendez and McDonald, where increased hard particle content lead to decreased deposition.
rates due to hard particle rebounding during impact [30]. The effect of particle rebound contributes less to the cross-sectional porosity. This is because the successive deposition of particles causes the pores in the coating cross-section to collapse, forming a more consolidated structure.

3.2 Analysis of parameter effects

To understand the effect of each spray parameter on the coating, response plots for each parameter and coating property were created as illustrated in Fig. 7. The response plots
illustrate the system response at each, separate level. It is observed in Fig. 7 that the feed rate has the largest effect on the response between the three levels for coating thickness. According to Taguchi and factorial design principles, the larger the difference between the responses, the more influential the spray parameter is. Therefore, it can be concluded that the feed rate has the greatest influence on the coating thickness. It is evident from Fig. 7, that increasing the feed rate increases the coating thickness. This can be attributed to the fact that increasing the feed rate in a spray process allows for more powder to be dispensed to the spray nozzle, which in turn leads to greater deposition onto the substrate, resulting in a thicker coating. It is also observed that increasing the gas temperature to 500°C causes the thickness response to increase. The deposition rate of particles increases with increase in temperature as increasing the temperature allows for enhanced thermal softening which is an essential bonding mechanism in cold spray coatings [39]. Increasing the stand-off distance from 3 to 5 mm also causes an increase in the thickness response. This can be explained by a phenomenon explored by Sarikaya where the in-flight particle temperature is described as a function of stand-off distance [48]. Increasing the stand-off distance increases the particle dwell time in the plume of the spray, which causes particle temperatures to rise [48]. Particles that attain higher temperatures will have improved bonding with the substrate thereby improving the deposition efficiency and coating thickness. It is observed in Fig. 4 that the coating thickness was significantly increased as the stand-off distance was increased from 3 to 5 mm, and then decreased slightly as the stand-off distance was increased from 5 to 10 mm. The fluctuation in the rate of change of the coating response with increasing stand-off distance can be attributed to the effect of stand-off distance on in-flight particle velocities. Increasing the stand-off distance increases in-flight particle drag, which results in in-flight velocity losses for the particles [45]. For efficient deposition in a cold spray process, it is important for the in-flight particle velocities to be within the range of critical velocity and erosion velocity [60]. In-flight particles must attain a critical impact velocity in order to undergo sufficient deformation upon impact to ensure good adhesion and deposition [60]. However, increasing the particle velocities beyond the erosion velocity increases particle rebounding leading to poor adhesion and deposition [60]. The rapid increase in coating thickness as the stand-off distance increases from 3 to 5 mm suggests that in-flight particles attain critical impact velocity between a stand-off distance of 3 and 5 mm. Increasing the stand-off distance from 5 to 10 mm subsequently decreases the particle velocities at impact leading to lower deposition and reduced thickness.

Similarly, for the coating hardness, it is seen in Fig. 7, that the feed rate is the most influential spray parameter as it exhibits the largest difference in the response. It is observed that the hardness response increases significantly when the feed rate is increased to its maximum [23.7 g/min]. As the feed rate increases, the content of WC in the coating also increases as more particles are dispensed in the spray plume. The increased content of WC promotes load sharing between the coating matrix and the hard particles, thereby yielding higher hardness values [33]. Greater content of WC in the coating increases the interfacial area available to share the load from the coating matrix during application of external loads [33]. Munday, et al. also concluded that increasing hard particle content leads to a decrease in the mean free path between hard particles which inhibits plastic deformation of the coating under loaded conditions by stopping coalescence of nucleated voids, thereby leading to harder coatings [33].
The response reaches a maximum when the stand-off distance goes from 3 to 5 mm (Fig. 7); however, further increasing the stand-off to 10 mm decreases the response. The variation in the response as the stand-off distance is increased can be attributed to the powder particle impact velocity, which is influenced by the stand-off distance. Goyal, et al. found that having smaller stand-off distances increases the in-flight velocity of the impacting particles; therefore, for smaller stand-off distances, the impacting velocity of the particles is higher [45]. This higher net impact velocity creates a peening effect in the coating, consolidating it and causing it to become more dense. This consequently increases the coating hardness [45]. The phenomenon found by Sarikaya also explains the varying response of the coating hardness [48]. As established earlier, increasing the stand-off distance increases the particle dwell time in the spray plume causing the particle temperatures to increase. However, increasing the stand-off distance past an optimal point causes the particles to decrease in temperatures as the isotherms in the plume begin to decay [48]. Therefore, increasing the stand-off distance past a certain point causes the deposition rate to decrease and, consequently, causing the coating hardness to decrease. Coating hardness is also greatly affected by the amount of reinforcing particles like WC in the coating. Although the content of WC particles in the powder blend is held constant for this study, the amount of WC particles in the coating varies with changing operation parameters [33]. Therefore, it can also be concluded that the WC content in the coating is maximized when a stand-off distance of 5 mm is used, thus yielding higher hardness. Increasing the temperature to 500°C causes the coating hardness to increase. This response is in agreement with the coating thickness response to temperature increase.

Next, the surface porosity appears to be most influenced by the feed rate and the stand-off distance, as illustrated in Fig. 7. As the stand-off distance increases from 3 to 10 mm, the coating porosity decreases significantly. A similar trend was found by Qiao, et al. where increasing the stand-off distance led to increased particle dwell time in the plume leading to higher particle temperatures [44]. The increased particle temperatures enhance thermal softening leads to flatter particles upon impact that are easier to tile with the previously deposited particles, consequently collapsing the pores in the coating [44]. Increasing the feed rate causes the porosity response to increase (Fig. 7), as hard particle rebounds increase with increasing feed rates leaving pores in the rebound locations. Though increasing the feed rate does yield a thicker coating, the coating contains more pores due to particle rebounds, thereby causing the porosity response to increase. The porosity response to temperature variation does not exhibit a clear trend (Fig. 7) as the feed rate and stand-off distance exhibit antagonistic responses and their coupled response may overwhelm the response due to temperature variation alone. Additional fractional factorial studies can be conducted to get information about the coupled relationships of varying the feed rate, stand-off distance, and temperature to make conclusions about the coupled responses. Though modelling and simulation of particle deposition can be used to predict the response of the coatings to parameter variation beyond the selected levels [46–48], the feasibility of achieving viable coatings while operating at parameter levels beyond the ranges studied becomes very low due to the operational limitations of the cold spray experimental setup. With the feed rate being the only parameter that can be varied beyond the range analyzed in this study while still achieving viable coatings, it can be predicted that increasing the feed rate beyond 23.7 g/min, would lead to increased deposition due to increase of particles saturating the spray plume, resulting in increase in coating thickness and hardness due to material consolidation.

### 3.3 Analysis of variance (ANOVA)

The analysis of variance (ANOVA) was conducted using the statistical software Minitab to determine the significance of each spray parameter on the coating thickness, hardness, and surface porosity, which is crucial to understanding and predicting the response of the system. ANOVA is performed by comparing the variability in the response contributed by each spray parameter with the total variability of the response. The total variability is the sum of squared deviations (SS) from the total mean of the response (MS) for a total of N samples. The F ratios are calculated for each spray parameter and compared with the critical F ratio which is found using the selected confidence interval α and the degrees of freedom for the selected parameter k. For this study, if the F ratio for a specific spray parameter is larger than 4.20, that spray parameter can be concluded to have significant influence on the coating quality.

\[
MS = \frac{SS}{N-k} \quad (1)
\]

\[
F_{ratio} = \frac{MS_{parameter}}{MS_{error}} \quad (2)
\]

Using Eqs. 1 and 2, ANOVA was performed for the coatings generated. The ANOVA results for coating thickness, hardness and porosity are summarized in Tables 2, 3, and 4, respectively. It was found that the feed rate and stand-off distance both had significant influence on the coating thickness as their F ratios were larger than 4.20. It was also found that the interaction between temperature and stand-off distance also had significant influence on the coating thickness, as seen in Table 2. The feed rate and stand-off distance were also the largest contributors in the coating response, contributing 31% and 28% of the total response respectively, as tabulated in Table 2. All the other parameters and interactions...
were found to have insignificant influence on the coating thickness as they have \( F \) ratios of less than 4.20.

The ANOVA results for coating hardness and surface porosity concluded that none of the spray parameters had significant influence on the coating hardness and porosity as the \( F \) ratios were all below 4.20. It was found for the surface porosity, the greatest contribution to the response was 45% from the temperature. For the coating hardness, as indicated by the response plots (Fig. 4), the interaction between the parameters had a greater effect than the individual parameters themselves. As seen in Table 3, the largest contributor for the coating hardness is the interaction between feed rate and stand-off distance, contributing 37% of the overall response. The interaction between feed rate and temperature, and temperature and stand-off distance come in next contributing 27% and 23% of the effect, respectively. This further concludes that, unlike coating thickness and surface porosity, the coating hardness response is governed by the interaction effects between the spray parameters. Since the parameters all had \( F \) values lower than 4.20 for the coating hardness and porosity (Table 4), their effects are concluded to be insignificant; however, it is advantageous to know the largest contributors that affect the coating hardness and surface porosity to allow for further investigations and optimization studies. The insignificance of these parameters for the coating hardness and surface porosity can be due to the large size of the experimental design or inherent inconsistencies in the system which overwhelm the statistical studies.

### 3.4 Optimizing operation parameters

Using the results from the effects plots and ANOVA, an optimization study was performed using Minitab to determine the optimal spray parameters (OSP) that would produce the best coating quality possible for this system. The goals for this optimization study were to maximize the coating thickness and hardness, while minimizing the surface porosity. The goals were selected in order to produce the thickest and hardest coating possible to achieve improved wear and erosion performance [59], and to achieve thicker coatings to increase the coating life span [61]. The porosity was selected to be minimized to achieve a more uniform, less porous coating to avoid localized areas of increased stress in loaded conditions [62]. The optimal spray parameters (OSP) were found to be 23.7 g/min for the feed rate, 500°C for the temperature and 10 mm for the stand-off distance. The OSP would yield a coating that is 1.22 ± 0.06 mm thick, with a hardness of 364.5 ± 8.5 HV, and a porosity of 6.8 ± 0.6%.

### Table 2 ANOVA results for coating thickness

| Symbol | Parameter       | Degrees of Freedom | Mean Sum of Squares | \( F \) value | Contribution [%] |
|--------|-----------------|--------------------|---------------------|---------------|-----------------|
| A      | Feed Rate       | 2                  | 0.176               | 9.26          | 31.22           |
| B      | Temperature     | 2                  | 0.072               | 3.81          | 12.85           |
| C      | SOD             | 2                  | 0.160               | 8.41          | 28.35           |
| A*B    | Feed Rate * Temperature | 4 | 0.016               | 0.83          | 2.80            |
| A*C    | Feed Rate * SOD | 4                  | 0.058               | 3.04          | 10.25           |
| B*C    | Temperature * SOD | 4                | 0.082               | 4.31          | 14.53           |
| Error  |                 | 8                  | 0.019               |               |                 |
| Total  |                 | 26                 |                     |               |                 |

### Table 3 ANOVA results for coating hardness

| Symbol | Parameter       | Degrees of Freedom | Mean Sum of Squares | \( F \) value | Contribution [%] |
|--------|-----------------|--------------------|---------------------|---------------|-----------------|
| A      | Feed Rate       | 2                  | 241.15              | 0.42          | 8.27            |
| B      | Temperature     | 2                  | 91.01               | 0.16          | 3.15            |
| C      | SOD             | 2                  | 26.13               | 0.05          | 0.98            |
| A*B    | Feed Rate * Temperature | 4 | 799.07              | 1.38          | 27.17           |
| A*C    | Feed Rate * SOD | 4                  | 1097.16             | 1.90          | 37.40           |
| B*C    | Temperature * SOD | 4                | 676.25              | 1.17          | 23.03           |
| Error  |                 | 8                  | 578.55              |               |                 |
| Total  |                 | 26                 |                     |               |                 |
4 Conclusion

The influence of spray parameters on the thickness, hardness, and surface porosity of a low-pressure cold sprayed WC-17wt.% Ni coating were analyzed using a full factorial design study. The spray parameters analyzed were feed rate, temperature and stand-off distance. With the objective of optimizing the spray parameters to maximize the coating thickness and hardness while minimizing the surface porosity, the following conclusions were made:

1) The optimal spray parameters were found to be 23.7 g/min for the feed rate, 500°C for the temperature and 10 mm for the stand-off distance. This set of spray parameters would yield a coating that is 1.22 mm thick, with a hardness and surface porosity of 364.5 HV and 6.8%, respectively, making it the best possible coating within the parameter ranges selected in the design.

2) The most influential parameter for the coating thickness was the powder feed rate. The surface porosity was most influenced by the nozzle to substrate stand-off distance. The coating hardness was most influenced by the interaction between the feed rate and stand-off distance.

3) The interaction between the spray parameters also affected the quality of coating produced. The most important interaction for the coating thickness was between temperature and stand-off distance. For surface porosity, interactions between the feed rate and temperature, and feed rate and stand-off distance were important and influential. For the coating hardness, interactions between all three parameters were found to be largely influential.

4) The OSP created a coating that was dense and contained minimal porosity. The coating also portrayed excellent adhesion to the substrate as evident in the SEM images of the cross section.

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Author contribution Wania Jibran: Conceptualization; Methodology; Data curation; Formal analysis; Investigation; Visualization; Roles/Writing - original draft
James Hogan: Conceptualization; Funding acquisition; Investigation; Methodology; Project administration; Resources; Supervision; Writing - review & editing
André McDonald: Conceptualization; Funding acquisition; Investigation; Methodology; Project administration; Resources; Supervision; Writing - review & editing

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Declarations

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References

1. Alidokht SA, Yue S, Chromik RR (2019) Effect of WC morphology on dry sliding wear behavior of cold-sprayed Ni-WC composite coatings. Surf Coat Technol 357(October 2018):849–863. https://doi.org/10.1016/j.surfcoat.2018.10.082
34. Sacks N (2016) Low pressure cold gas dynamic spraying of tungsten carbide-nickel coatings. Met Powder Rep 71(5):356–358. https://doi.org/10.1016/j.mprr.2016.08.005

35. Mirjavadi SS, Alipour M, Emamian S, Kord S, Hamouda AMS, Koppad PG, Keshavamurthy R (2017) Influence of TiO2 nanoparticles incorporation to friction stir welded 5083 aluminum alloy on the microstructure, mechanical properties and wear resistance. J Alloys Compd 712:795–803. https://doi.org/10.1016/j.jallcom.2017.04.114

36. Mirjavadi SS, Alipour M, Hamouda AMS, Matin A, Kord S, Ashfari BM, Koppad PG (2017) Effect of multi-pass friction stir processing on the microstructure, mechanical and wear properties of AA5083/ZrO2 nanocomposites. J Alloys Compd 726:1262–1273. https://doi.org/10.1016/j.jallcom.2017.08.084

37. Hasniniyati MR, Zuhailawati H, Sivakumar R, Dhindaw BK (2015) Optimization of multiple responses using overlaid contour plot and steepest methods analysis on hydroxyapatite coated magnesium via cold spray deposition. Surf Coat Technol 280:250–255. https://doi.org/10.1016/j.surfcoat.2015.09.006

38. Cavalieri P, Silvello A (2014) Processing parameters affecting cold spray coatings performances. Int J Adv Manuf Technol 71(1–4):263–277. https://doi.org/10.1007/s00170-013-5465-0

39. Villa M, Dosta S, Guilemany JM (2013) Optimization of 316L stainless steel coatings on light alloys using Cold Gas Spray. Surf Coat Technol 235:220–225. https://doi.org/10.1016/j.surfcoat.2013.07.036

40. Goyal T, Walia RS, Sidhu TS (2013) Multi-response optimization of low-pressure cold-sprayed coatings through Taguchi method and utility concept. Int J Adv Manuf Technol 64(5–8):903–914. https://doi.org/10.1007/s00170-012-4049-8

41. Magaró P et al (2019) Effect of process parameters on the properties of Stellite-6 coatings deposited by Cold Gas Dynamic Spray. Surf Coat Technol 377(August):124934. https://doi.org/10.1016/j.surfcoat.2019.124934

42. Klinkov SV, Kosev VF, Rein M (2005) Cold spray deposition: Significance of particle impact phenomena. Aerosp Sci Technol 9(7):582–591. https://doi.org/10.1016/j.ast.2005.03.005

43. Liu T, Planche MP, Kanta AF, Deng S, Montavon G, Deng K, Ren ZM (2013) Plasma spray process operating parameters optimization based on artificial intelligence. Plasma Chem Plasma Process 33(5):1025–1041. https://doi.org/10.1007/s11090-013-9475-3

44. Qiao L, Wu Y, Hong S, Cheng J, Wei Z (2019) Influence of the high-velocity oxygen-fuel spray parameters on the porosity and corrosion resistance of iron-based amorphous coatings. Surf Coat Technol 366(December 2018):296–302. https://doi.org/10.1016/j.surfcoat.2019.03.046

45. Goyal T, Walia RS, Sidhu TS (2012) Effect of parameters on coating density for cold spray process. Mater Manuf Process 27(2):193–200. https://doi.org/10.1080/10426914.2011.566906

46. Goyal T, Walia RS, Sidhu TS (2012) Study of coating thickness of cold spray process using Taguchi method. Mater Manuf Process 27(2):185–192. https://doi.org/10.1080/10426914.2011.564249

47. Goyal T, Walia RS, Sidhu TS (2012) Surface roughness optimization of cold-sprayed coatings using Taguchi method. Int J Adv Manuf Technol 60(5–8):611–623. https://doi.org/10.1007/s00170-011-3642-6

48. Sarkikaya Ö (2005) Effect of some parameters on microstructure and hardness of alumina coatings prepared by the air plasma spraying process. Surf Coat Technol 190:388–393. https://doi.org/10.1016/j.surfcoat.2004.02.007

49. Della Gatta R, Viscusi A, Perna AS, Caravelli A, Astarita A (2021) Feasibility of steel powder deposition on composites through cold spray. Mater Manuf Process 36(3):281–291. https://doi.org/10.1080/10426914.2020.1832693

50. Palodhi L, Singh H (2020) On the Dependence of Critical Velocity on the Material Properties During Cold Spray Process. J Therm Spray Technol 29(8):1863–1875. https://doi.org/10.1007/s11660-020-01105-7

51. Brown RF, Smith GM, Potter J, Eden TJ (2020) Parameter Development via In Situ Residual Stress Measurement and Post-deposition Analysis of Cold Spray CuNi Coatings. J Therm Spray Technol 29(8):1876–1891. https://doi.org/10.1007/s11660-020-01109-3

52. Kumar S, Bae G, Lee C (2016) Influence of substrate roughness on bonding mechanism in cold spray. Surf Coat Technol 304:592–605. https://doi.org/10.1016/j.surfcoat.2016.07.082

53. Wei YK, Luo XT, Li CX, Li CJ (2017) Optimization of In-Situ Shot-Peening-Assisted Cold Spraying Parameters for Full Corrosion Protection of Mg Alloy by Fully Dense Al-Based Alloy Coating. J Therm Spray Technol 26(1–2):173–183. https://doi.org/10.1007/s11660-016-0492-7

54. Hong S, Wu Y, Wang B, Zheng Y, Gao W, Li G (2014) High-velocity oxygen-fuel spray parameter optimization of nanostructured WC-10Co-4Cr coatings and sliding wear behavior of the optimized coating. Mater Des 55:286–291. https://doi.org/10.1016/j.matdes.2013.10.002

55. Silvello A, Cavaliere PD, Albaladejo V, Martos A, Dosta S, Cano IG (2020) Powder properties and processing conditions affecting cold spray deposition. Coatings 10(2):91. https://doi.org/10.3390/coatings10020091

56. Ren J, Zhang G, Rong Y, Ma Y (2021) A feature-based model for optimizing HVOF process by combining numerical simulation with experimental verification. J Manuf Process 64(January):224–238. https://doi.org/10.1016/j.jmapro.2021.01.017

57. Song X et al (2021) Correlation between the macroscopic adhesion strength of cold spray coating and the microscopic single-particle bonding behaviour: Simulation, experiment and prediction. Appl Surf Sci 547(Feb):149165. https://doi.org/10.1016/j.apsusc.2021.149165

58. R. Mukerjee and C. F. J. Wu, A Modern Theory of Factorial Design. Springer Science & Business Media, 2007.

59. Lee YTR, Ashrafizadeh H, Fisher G, McDonald A (2017) Effect of type of reinforcing particles on the deposition efficiency and wear resistance of low-pressure cold-sprayed metal matrix composite coatings. Surf Coat Technol 324:190–200. https://doi.org/10.1016/j.surfcoat.2017.05.057

60. Moridi A, Hassani-Gangaraj SM, Guagliano M (2013) A hybrid approach to determine critical and erosion velocities in the cold spray process. Appl Surf Sci 273:617–624. https://doi.org/10.1016/j.apsusc.2013.02.089

61. Zhang N, Yang F, Li L, Shen C, Castro J, Lee LJ (2013) Thickness effect on particle erosion resistance of thermoplastic polyurethane coating on steel substrate. Wear 303(1–2):49–55. https://doi.org/10.1016/j.wear.2013.02.022

62. Lioma D, Sacks N, Botef I (2015) Cold gas dynamic spraying of WC-Ni cemented carbide coatings. Int J Refract Met Hard Mater 49(1):365–373. https://doi.org/10.1016/j.jrmhm.2014.08.017

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