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RESEARCH ARTICLE

Jerk-Continuous Feedrate Optimization Method for NURBS Interpolation

MINGXING NIE[®], LIWEI ZOU, AND TAO ZHU[®], (Member, IEEE)

School of Computer Science, University of South China, Hengyang 421001, China

Corresponding author: Tao Zhu (tzhu@usc.edu.cn)

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ABSTRACT Feedrate scheduling is one of the most critical technologies in CNC machining, requiring a reasonable balance between efficiency and quality. This paper proposes a jerk-continuous feedrate smoothing (JCFS) method to generate a low-vibration and smooth feedrate profile for non-uniform rational B-spline (NURBS) interpolation. Firstly, the segmentation concept is introduced to subdivide the entire trajectory into segments to accommodate curvature changes of the NURBS curve, accelerating the acceleration/deceleration process. Secondly, a length threshold-based curve segment classification method is proposed to overcome the complexity of the traditional acceleration and deceleration algorithms. The curve segments are divided into long, medium, and short types, and the length threshold calculation model is derived. Next, to avoid computational complexity for engineering applications, a model is established for the first time to calculate the actual maximum feedrate for different types of segments. Finally, the horizontal-8-shaped and butterfly-shaped NURBS curves are simulated and analyzed. The simulation results indicate that the machining quality is steadily improved while several key indicators remain within the given tolerances. Compared with the traditional method, the proposed method reduces the computational and interpolation time by 17.2% and 22.8%, respectively, demonstrating the feasibility and effectiveness of the method.

INDEX TERMS Feedrate scheduling, NURBS interpolation, jerk-continuous, segmentation.

I. INTRODUCTION

Due to the advantages of NURBS interpolation in terms of machining accuracy and code size, many scholars have been interested in applying NURBS direct interpolation in CNC to meet the requirements of surface quality and machining time [1], [2], [3], [4], [5]. NURBS direct interpolation has gradually become the main technology in multi-axis CNC machining [6], [7], [8], [9], [10].

After decades of development, several NURBS direct interpolation methods have been proposed. Shpitalni et al. first proposed the concept of NURBS direct interpolation [6]. Then, Yang and Kong presented Taylor's expansion-based NURBS interpolation [11]. Erkorkmaz et al. developed a quintic spline interpolation method [12]. Lei et al. proposed the inverse length functions (ILF) method [13]. However, these methods inevitably suffer from high chord errors, acceleration, and jerk exceeding given tolerances due to curvature.

The feedrate should be changed to keep the chord error within the tolerance. The NURBS interpolator feedrate scheduling method is applied to improve machining accuracy and motion smoothness. Yeh and Hsu put forward an adaptive feedrate interpolator to satisfy the given tolerance of chord error [14]. However, this method suffers from the feedrate discontinuity problem. Sun et al. proposed a new algorithm based on proportional adjustment for the sensitive regions to obtain the adaptive feedrate profile [15], which is too computationally intensive for real-time imputation. Wang et al. developed an offline-online two-stage NURBS interpolator, which applies a constant feedrate scheduling method to the NURBS segment [16]. Jia et al. also proposed a systematic NURBS interpolator that maintains a constant feedrate in the federate-sensitive region, which reduces the

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 TABLE 1. The comparison of jerk-continuous ACC/DEC methods.

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Reference	ACC/DEC	Jerk Profile	Machining	Computational
	method	Continuity	efficiency	load
[24]	5th order	second-order	Low	High
	polynomial	continuous		
	functions			
[25]	piecewise	Continuous	High	High
[]	trigonometric		8	8
	function			
[26]	piecewise quartic	first-order	Low	High
[20]			LOW	Ingn
F	spline curve	continuous		-
[27]	trigonometric	Continuous	Low	Low
	functions			
[28]	polynomial	discontinuous	Low	Low
	functions			
[29]	trigonometric	Continuous	High	High
	methods		e	e
[30]	polynomial	Continuou	High	High
[30]	porynolillar	Continuou	rign	rugii
	functions	s		

processing complexity at the expense of time efficiency [17]. Ni et al. presented a bidirectional feedrate s. Guo et al. developed a feedrate planning method, including three combined curves: a critical deceleration curve, a straight line, and a critical acceleration curve to reduce computing load and improve efficiency [19]. However, sudden changes in curvature will lead to discontinuous feedrates, causing acceleration beyond the machine's capacity and vibration.

Several new interpolations were constructed in literature to address these issues [20], [21], [22], [23]. Javad et al. first proposed the acc-jerk-limited feedrate scheduling by the improved quintic feedrate profile [20]. Sun et al. [21] developed a relaxation mathematical process feedrate scheduling method with a little jerk for five-axis CNC machining. Erwinski et al. [22] presented a PSO-based feedrate optimization method to select appropriate axial velocity, acceleration, and jerk for NURBS interpolation. Although Krystian Adam Erwinski et al. [23] presented a new NURBS feedrate optimization method with axial acceleration and jerk constraints, the presented method still suffers from the jerk discontinuity problem.

Various jerk-continuous methods have been presented in the literature to solve the jerk-discontinuity problem, as shown in Table 1 [24], [25], [26], [27], [28], [29], [30]. P. Boscariol et al. presented novel trajectory-planning algorithms for an industrial robot using fifth-order polynomial functions [24]. Fang et al. presented a modified sine jerk motion profile based on piecewise trigonometric functions. However, these methods are only suitable for low-speed robot joint motion [25]. Zhao et al. proposed a new ACC/DEC approach with jerk continuity using the piecewise quartic spline curve [26]. Liu et al. adopted the trigonometric function method to establish the jerk continuous profile for NURBS interpolation. However, these methods cannot maintain the maximum jerk and acceleration, significantly reducing the machining efficiency [27]. Zhang et al. designed a linear jerk-continuous profile for feedrate scheduling [28], which cannot maintain the maximum acceleration. Ni et al. proposed a jerk profile construction method by combining trigonometric and polynomial functions [29]. However, this method has 16 stages and too many types of processing, leading to a high time overhead. Zhang et al. developed a new jerk-smooth feedrate scheduling method [30]. However, this method is time-consuming due to the use of highorder polynomials. Aiming at the smoothing of the velocity and acceleration at the end of the trajectory of adjacent micro-straight lines, Sun and Yang et al. focused on jerkcontinuous tool path smoothing and feedrate planning for 6-axis robot machining with more complex kinematics [31], [32]. However, these methods mainly construct a B-spline curve in the remaining part of the adjacent micro-straight lines trajectory, somewhat different from the proposed NURBS direct interpolation.

Inspired by these works, this paper aims to design an efficient trigonometric-based jerk-continuous profile for NURBS interpolation to reduce feedrate fluctuations and improve interpolation efficiency. Compared to traditional works, the proposed approach has the following salient features. Firstly, NURBS curves are subdivided into segments by confined curvature to accommodate curvature variations. Secondly, a length threshold-based segment classification method is proposed to overcome the complexity of conventional acceleration and deceleration algorithms. Finally, a model is derived for the first time to calculate the actual maximum feedrate for different segments.

The main contributions of this paper can be summarized as follows:

(1) We focus on the critical role of curvature in the NURBS interpolation, present the concept of confined curvature, and implement segmentation of NURBS to adapt to the curvature variations.

(2) A trigonometric-function-based jerk-continuous feedrate smoothing (JCFS) method is proposed to overcome the feedrate fluctuation.

(3) The proposed JCFS is employed to derive the analytic expression for calculating the maximum feedrate of different length curve types for the first time, which can significantly simplify the ACC/DEC implementation process.

The rest of this paper is organized as follows. Section II describes the architecture of the proposed jerk-continuous feedrate optimization interpolator. Section III introduces the preliminaries, including NURBS interpolation, confined curvature, and curve segmentation. The jerk-continuous NURBS interpolation is designed in Section IV. Section V provides the simulation results of the proposed method applied to horizontal-8-shaped and butterfly-shaped NURBS curves. Finally, conclusions and future aspects are presented in Section VI.

II. JERK-CONTINUOUS FEEDRATE OPTIMIZATION INTERPOLATOR ARCHITECTURE

The interpolation feedrate will be continuously influenced by geometric and dynamic characteristics [35]. The feedrate should be dynamically adjusted to satisfy the tolerance of

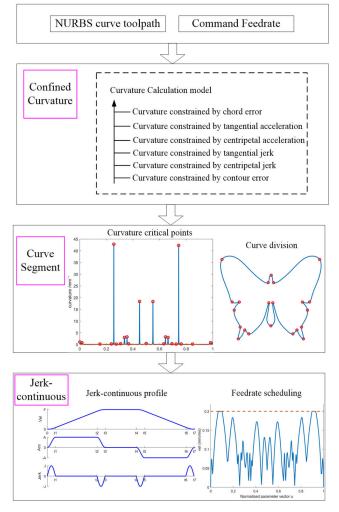


FIGURE 1. The architecture of the jerk-continuous NURBS interpolator.

specific constraints. However, since the geometric properties vary continuously along with the NURBS, using the same feedrate limits for the entire curve is inefficient. Different processing strategies can be employed depending on the region of curve curvature. Here, the method proposed in reference [3] for partitioning NURBS curves according to the confined curvature is utilized [3].

The curve segmentation is based on dividing a NURBS curve into segments by critical curvature points. A critical curvature point is obtained from the local maximum curvature point in the curvature-sensitive region obtained by the confined curvature.

As shown in Fig. 1, the architecture of the proposed method proposed is specified as follows.

Firstly, according to the NURBS curve defined in Eq. 1, the interpolator reads the NURBS curve tool path and kinematic parameters in turn, including control points and node vectors, as well as other information such as commanded feed rate, acceleration, and Jerk. Based on these inputs, the constrained curvature is calculated, and the NURBS curve can be divided into several parts with constrained curvature containing curvature-sensitive areas. Then, the critical point is found at the curvature-sensitive region, which is the local curvature maximum point. The NURBS curve is segmented into several curve parts by the critical points so that the subsequent acceleration and deceleration can be processed independently in the curve segment unit.

Finally, the jerk-continuous method based on trigonometric functions is proposed. The curves are divided into long, medium, and short categories. All curve segments are recalculated to the maximum achievable velocity. Besides, the jerk-continuous feedrate optimization is performed according to the proposed acceleration/deceleration method to realize continuous interpolation of velocity/acceleration/jerk.

III. PRELIMINARIES

A. PRINCIPLE OF THE NURBS INTERPOLATION

The definition of the NURBS curve can be expressed as follows [33]:

$$C(u) = \frac{\sum_{i=0}^{n} N_{i,p}(u)\omega_i p_i}{\sum_{i=0}^{n} N_{i,p}(u)\omega_i}, u_1 \le u \le u_{n+p+1}$$
(1)

where i=0, 1, ..., n; $\{P_i\}$ is the set of control points; $\{\omega_i\}$ is the set of weights; $\{N_{i,p}(u)\}$ represents the B-spline basic functions; u is the normalized parameter vector.

The commonly used Taylor expansion method is adopted to estimate the parameter for point C(u) [34].

$$u_{i+1} = u_i + \frac{du}{dt}\Big|_{t=t_i} + \frac{1}{2} \frac{d^2 u}{dt^2}\Big|_{t=t_i} T^2 + \varepsilon$$
(2)

where T is the cycle period. ε is a high-order term that can be ignored.

The feedrate can be obtained by differentiating from Eq. (1) versus t

$$v(u_i) = \left\| \frac{dC(u)}{dt} \right\|_{u=u_i} = \left\| \frac{dC(u)}{du} \right\|_{u=u_i} \frac{du}{dt} \bigg|_{t=t_i}$$
(3)

Then, the first-order derivative of u with respect to time t is given by

$$\left. \frac{du}{dt} \right|_{t=t_i} = \frac{v(u_i)}{\left\| \frac{dC(u)}{du} \right\|_{u=u_i}} \tag{4}$$

Similarly, the second-order derivative of u is given by

$$\frac{d^2 u}{d^2 t}\Big|_{t=t_i} - \frac{v^2(u_i)\left(\frac{dC(u)}{du} \cdot \frac{dC^2(u)}{du^2}\right)\Big|_{u=u_i}}{\left\|\frac{dC(u)}{du}\right\|_{u=u_i}^4}$$
(5)

The curvature of the NURBS curve can be expressed as

$$k = \frac{\|C^{(1)}(u) \times C^{(2)}(u)\|}{\|C^{(1)}(u)^3\|}$$
(6)

The radius of curvature can be obtained as

$$\rho = \frac{1}{k} \tag{7}$$

Thus, substituting equations 4 and 5 into Eq.2 gives

$$u_{i+1} = u_i + \frac{v(u_i)T}{\left\|\frac{dC(u)}{du}\right\|_{u=u_i}} - \frac{v^2(u_i)\left(\frac{dC(u)}{du} \cdot \frac{dC^2(u)}{du^2}\right)\Big|_{u=u_i}}{\left\|\frac{dC(u)}{du}\right\|_{u=u_i}^4}$$
(8)

According to Eq.8, the parameter u_{i+1} of $C(u_{i+1})$ can be estimated based on the current interpolation parameter u_i , the current velocity $v(u_i)$, and the interpolation period T.

B. CONFINED CURVATURE AND CRITICAL POINT

Geometric and kinematic characteristics, drive, and contour error constraints constantly influence Feedrate. The multiple constraints are introduced here [35] to obtain the constrained curvature radius model as

$$\begin{cases} \rho_{i,1} = \frac{v^2 T^2 + 4\delta^2}{8\delta} \\ \rho_{i,2} = \frac{v^2}{a_n} \\ \rho_{i,3} = \sqrt{\frac{v^3}{j_n}} \\ \rho_{i,4} = \frac{v^2 T^2}{2\varepsilon} \end{cases}$$
(9)

where v, T are the velocity and cycle time, δ, ε are the tolerance of chord and contour errors, respectively, a_n, j_n are the maximum normal acceleration and normal jerk.

Thus, from Eq. 7 and Eq. 9, the confined curvature k_c can be obtained as follows.

$$k_c = \min(1/\rho_{i,1}, 1/\rho_{i,2}, 1/\rho_{i,3}, 1/\rho_{i,4})$$
(10)

The above analysis indicates that when the curve curvature is less than the confined curvature k_c , the feedrate of the NURBS interpolator can satisfy various constraints and remain at the command velocity. On the contrary, when the curve curvature is greater than the confined curvature k_c , the feedrate should be reduced to satisfy the machining accuracy, and the feedrate should be simultaneously adjusted to meet the kinematic characteristic. Therefore, the region of the curve below the confined curvature is defined as the curvature-sensitive region. Due to the curvature continuity characteristics of the cubic NURBS curve, the local curvature maximum point can be found from the curvature-sensitive region and employed as the critical point. The NURBS curve can be divided into several curve segments by the critical points so that the subsequent acceleration and deceleration can be processed independently in terms of curve segments.

C. CURVE SEGMENT LENGTH

The adaptive Simpson's method is utilized to calculate the curve segment length. For more details, please refer to reference [17]. Finally, the arc displacements of each curve segment between two adjacent critical points can be calculated. The constraint velocity for the curve segment can be obtained by inverse derivation of Eq.9 to obtain the corresponding features vector, where u_s and u_e are the start point and end point parameters of the curve segment, v_s and v_e are the constrained velocity, l_i is the arc length of the curve segment.

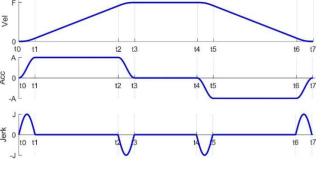


FIGURE 2. The jerk-continuous feedrate profile.

IV. DESIGN OF JERK-CONTINUOUS NURBS INTERPOLATION

The curve segmentation aims to impose acceleration and jerk constraints on the feedrate scheduling in a tangential direction based on the proposed acceleration and deceleration algorithms. However, since it is difficult to determine the actual velocity, the feedrate scheduling is very complicated for different lengths of curve segments, especially mediumlong curve segments. Generally speaking, there may be dozens of accelerations and deceleration processing types for different-length curve segments.

This section illustrates the details of the proposed jerkcontinuous ACC/DEC feedrate scheduling. Firstly, the jerkcontinuous scheduling method is introduced based on the trigonometric function, which can effectively improve jerk continuity at the start and stop times to prevent the vibration caused by the sudden increase or drop of the jerk. Secondly, the calculation model of the actual allowable feedrate of the curve segment is deduced, which is the most effective solution to solve the feedrate scheduling of the curve segment with different lengths. Finally, two constant acceleration stages are added based on the 5-stage jerk-continuous method [36] to improve velocity acceleration and deceleration capabilities.

A. JERK-CONTINUOUS FEEDRATE PROFILE

As shown in Fig. 2, the trigonometric-function-based jerkcontinuous feedrate optimization method is proposed based on [37]. The method includes the acceleration rising stage, constant stage, and falling stage. The acceleration rising stage is subdivided into three phases: acceleration increase/acceleration constant/acceleration decrease. The acceleration falling stage also includes three subdivision phases. The jerk expression at any time *t* can be described as follows:

$$j(t) = \begin{cases} \frac{\pi}{2T_1} A \sin \frac{\pi}{T_1} t & t_0 \le t < t_1 \\ 0 & t_1 \le t < t_2 \\ -\frac{\pi}{2T_3} A \sin \frac{\pi(t-t_2)}{T_3} & t_2 \le t < t_3 \\ 0 & t_3 \le t < t_4 \\ -\frac{\pi}{2T_5} A \sin \frac{\pi(t-t_4)}{T_5} & t_4 \le t < t_5 \\ 0 & t_5 \le t < t_6 \\ \frac{\pi}{2T_7} A \sin \frac{\pi(t-t_6)}{T_7} & t_6 \le t \le t_7 \end{cases}$$
(11)

where *A* is the maximum acceleration. t_0 - t_1 is the phase the jerk changes according to the trigonometric function, which increases from 0 to the maximum jerk, and then decreases from the maximum jerk to 0; t_1 - t_2 is the phase where the jerk remains at 0; t_2 - t_3 is the inverse process of t_0 - t_1 . t_3 - t_4 is also the phase where the jerk remains at 0; t_4 - t_7 is the inverse process of t_0 - t_1 . The inverse process of t_0 - t_2 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_2 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_2 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 . The inverse process of t_0 - t_2 . The inverse process of t_0 - t_1 is the inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 is the inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 is the inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 is the inverse process of t_0 - t_1 . The inverse process of t_0 is the inverse process of t_0 - t_1 . The inverse process of t_0 - t_1 is the inverse process of t_0 is the inv

Integrating Eq.11 yields the following acceleration equation:

$$a(t) = \begin{cases} A(1 - \cos\frac{\pi t}{T_1})/2 & t_0 \le t < t_1 \\ A & t_1 \le t < t_2 \\ A(1 + \cos\frac{\pi (t - t_2)}{T_3})/2 & t_2 \le t < t_3 \\ 0 & t_3 \le t < t_4 \\ -A(1 - \cos\frac{\pi (t - t_4)}{T_5})/2 & t_4 \le t < t_5 \\ -A & t_5 \le t < t_6 \\ -A(1 + \cos\frac{\pi (t - t_6)}{T_7})/2 & t_6 \le t \le t_7 \end{cases}$$
(12)

where A is the maximum acceleration, t_0 - t_1 is the increasing acceleration phase based on the trigonometric function to increase from 0 to the maximum acceleration continuously; t_1 - t_2 is the constant acceleration phase, maintaining the maximum acceleration so that the velocity can be increased rapidly with the maximum acceleration; t_2 - t_3 is the decreasing acceleration phase, which employs the trigonometric function to decrease from the maximum acceleration to 0 continuously. t_3 - t_4 is the phase that keeps the acceleration at 0; t_4 - t_7 is the inverse process of t_0 - t_3 .

By integrating Eq.12, the velocity equation can be obtained as (13), shown at the bottom of the next page, where v_s , V_f and v_e are the start, command, and end velocities. T_1 is the duration time from t_0 to t_1 , and T_2 - T_7 are similarly the corresponding durations of t_2 - t_7 . The velocity corresponding to the time points of T_1 , T_2 , T_3 , T_4 , T_5 , T_6 , and T_7 are v_1 , v_2 , v_3 , v_4 , v_5 , v_6 , and v_7 . One equation can be obtained from Eq.13.

$$v_{0} = v_{s}$$

$$v_{1} = v_{s} + \frac{A}{2}T_{1}$$

$$v_{2} = v_{s} + \frac{A}{2}T_{1} + AT_{2}$$

$$v_{3} = V_{f} = v_{s} + \frac{A}{2}T_{1} + AT_{2} + \frac{A}{2}T_{3}$$

$$v_{4} = V_{f}$$

$$v_{5} = V_{f} - \frac{AT_{5}}{2}$$

$$v_{6} = V_{f} - \frac{AT_{5}}{2} - AT_{6}$$

$$v_{7} = v_{e} = V_{f} - \frac{AT_{5}}{2} - AT_{6} - \frac{AT_{7}}{2}$$
(14)

When the maximum Jerk is J, the following equation can be derived from Eq.11

$$J = \frac{\pi}{2T_1} A = \frac{\pi}{2T_3} A = \frac{\pi}{2T_5} A = \frac{\pi}{2T_7} A$$
(15)

According to Eq.15, the following formula can be obtained:

$$T_1 = T_3 = T_5 = T_7 = \frac{\pi}{2} \frac{A}{J}$$
(16)

Eq.14 shows that

$$\begin{cases} V_f = v_s + \frac{A}{2}T_1 + AT_2 + \frac{A}{2}T_3 \\ v_e = V_f - \frac{AT_5}{2} - AT_6 - \frac{AT_7}{2} \end{cases}$$
(17)

By combining formulas 16 and 17, the following formula can be obtained:

$$\begin{cases} A = \frac{V_f - v_s}{T_1 + T_2} \\ A = \frac{V_f - v_s}{T_5 + T_6} \end{cases}$$
(18)

Then

$$\begin{cases} T_2 = \frac{V_f - V_s}{V_f - V_e} - T_1 \\ T_6 = \frac{V_f - V_e}{A} - T_5 \end{cases}$$
(19)

For every NURBS curve segment, the time of the seven phases T_1 - T_7 in the proposed method can be obtained according to Eqs.17-19. The feedrate at any time can be calculated according to Eq.14.

B. CURVE SEGMENT CLASSIFICATION

The NURBS curve is segmented into several curve segments. However, each curve segment has a different arc length. According to the proposed jerk-continuation method, when the arc length is not enough to accelerate the feedrate to the commanded one, some of the seven stages will not exist. There may be many complex and difficult special cases (i.e., seventeen feedrate profiles in [36]). So far, there is still no simple and effective method to deal with the feedrate scheduling problem for different length curve segments.

The main problem is that the actual maximum velocity cannot be directly obtained for different length curve segments. In this respect, the NURBS curve segments are classified into long, medium, and short segments. For the long segments, since the feedrate can reach the command velocity, the feedrate scheduling process is performed according to the proposed 7-phase jerk-continuous profile; For the medium segments, a mathematical model of the achievable velocity is established to solve the problem that the curve segment is not long enough or not very short and should generate various special feedrate profiles to deal with; For the short segments, considering the complexity and efficiency of processing, the interpolation of the curve segment is completed at a low feedrate in a constant velocity mode. Due to the short arc length, it cannot significantly influence the processing efficiency for the entire NURBS curve, while the provided simplicity and precision are significant.

1) TYPES OF CURVE SEGMENTS

Here, the definitions for three different curve segments are presented based on curve segment length. Suppose L_{med} and

 L_{\min} refer to the criterion for the medium and short segments, respectively.

 $\begin{cases} long \text{ segment:} & \text{if } L > L_{med} \\ medium \text{ segment:} & \text{if } L \ge L_{\min} \text{ and } L \le L_{med} \\ short \text{ segment:} & \text{if } L < L_{\min} \end{cases}$ (20)

where L is the curve segment length. The segment is long if its curve is longer than L_{med} ; The segment is short if its curve is shorter than L_{min} ; the segment is medium if its curve is between L_{med} and L_{min} .

In [29], the acceleration rising and falling phases are divided into three sub-phases, increasing the velocity processing complexity. In this paper, the three sub-stages are integrated into one stage so that the T_{i1} , T_{i2} , and T_{i3} parts can be combined into one part (T_i) to reduce the processing complexity.

Here, we assume F is the achievable velocity. According to [29], the acceleration and deceleration displacements, denoted by s_{acc} and s_{dec} , can be obtained as:

$$\begin{cases} s_{acc} = \frac{(F+v_s)(T_1+T_2+T_3)}{2} \\ s_{dec} = \frac{(F+v_e)(T_5+T_6+T_7)}{2} \end{cases}$$
(21)

where *F* is the actual velocity, v_s and v_e are the beginning and end velocities, and T_1 - T_7 are the time durations of each phase. When the segment is long enough, the actual velocity can equal the command velocity V_f , and there will be a constant velocity phase. As the length of the curve segment reduces, there may be no constant velocity phase, and the velocity cannot reach the command velocity. Let *L* be the shortest distance that the actual velocity can reach the command velocity, and there is just no constant velocity phase. It can be obtained that:

$$L = s_{acc} + s_{dec} = \frac{(F + \nu_s)(T_1 + T_2 + T_3) + (F + \nu_e)(T_5 + T_6 + T_7)}{2} \quad (22)$$

Then, the criterion length for L_{med} defined in Eq.20 can be expressed as:

$$L_{med} = \frac{(F + v_s)(T_1 + T_2 + T_3) + (F + v_e)(T_5 + T_6 + T_7)}{2}$$
(23)

The expression of L_{\min} will be given in Section 4.2.3.

2) THE ACTUAL ACHIEVABLE FEEDRATE

This paper considers the following definitions. The maximum achievable feedrate for the long segment is equal to the command feedrate. The maximum achievable feedrate for the short segment is the minimum feedrate at both ends of the segment. The maximum achievable feedrate for the medium segment is generally less than the command velocity, directly related to the curve segment length.

Next, the derivation process of the maximum achievable feedrate for the medium segment will be presented. Suppose L is the length of the medium segment, where $L \ge L_{min}$ and $L \le L_{med}$.

Substituting Eq. (16) and Eq. (19) into Eq. (23) gives (24), as shown at the bottom of the next page.

Then, we can get the following quadratic equation:

$$2F^{2} + F\frac{\pi A^{2}}{J} + v_{s}\frac{\pi A^{2}}{2J} + v_{e}\frac{\pi A^{2}}{2J} - v_{s}^{2} - v_{e}^{2} - 2AL = 0 \quad (25)$$

Let $a = 2, b = \frac{\pi A^{2}}{J}, c = v_{s}\frac{\pi A^{2}}{2J} + v_{s}\frac{\pi A^{2}}{2J} + v_{e}\frac{\pi A^{2}}{2J} - v_{s}^{2} - v_{e}^{2} - 2AL$
2AL

In this way, the quadratic equation for *F* can be represented as:

$$aF^2 + bF + c = 0$$

In order to solve (25), the following notation is considered:

$$\Delta = b^2 - 4ac$$

= $8(v_s - \frac{1}{4}\frac{\pi A^2}{J})^2 + 8(v_e - \frac{1}{4}\frac{\pi A^2}{J})^2 + 16AL$ (26)

The detailed derivation process is presented in Appendix A. since A > 0 and L > 0, $\Delta = b^2 - 4ac > 0$

Then, there are two real solutions:

$$F = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a} \tag{27}$$

Since F > 0, -b < 0 and 2a>0, the solution of the equation is

$$F = \frac{-b + \sqrt{b^2 - 4ac}}{2a} \tag{28}$$

Thus, the maximum achievable velocity for the three segments can be obtained as follows (29), as shown at the bottom of the next page.

$$v(t) = \begin{cases} v_s + \frac{A}{2} \left(t - \frac{T_1}{\pi} \sin(\frac{\pi}{T_1} t) \right) & t_0 \le t < t_1 \\ v_s + \frac{A}{2} T_1 + A(t - t_1) & t_1 \le t < t_2 \\ v_s + \frac{A}{2} T_1 + A T_2 + \frac{A}{2} \left((t - t_2) + \frac{T_3}{\pi} \sin(\frac{\pi}{T_3} (t - t_2)) \right) & t_2 \le t < t_3 \\ V_f & t_3 \le t < t_4 \\ V_f - \frac{A}{2} \left((t - t_4) - \frac{T_5}{\pi} \sin(\frac{\pi}{T_5} (t - t_4)) \right) & t_4 \le t < t_5 \\ V_f - \frac{AT_5}{2} - A (t - t_5) & t_5 \le t < t_6 \\ V_f - \frac{A}{2} T_5 - A T_6 - \frac{A}{2} \left((t - t_6) + \frac{T_7}{\pi} \sin(\frac{\pi}{T_7} (t - t_6)) \right) & t_6 \le t \le t_7 \end{cases}$$
(13)

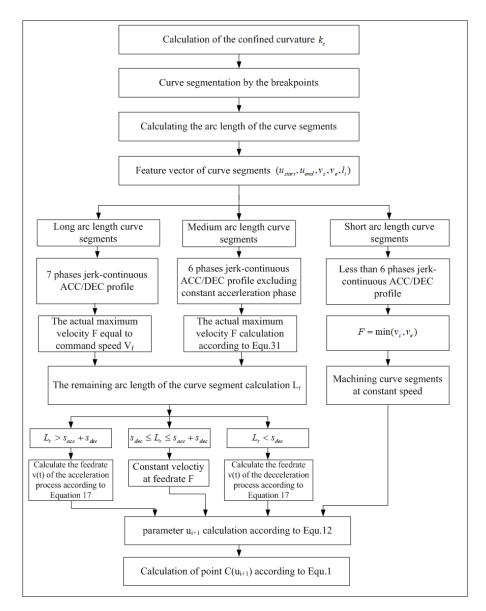


FIGURE 3. The flowchart of the ACC/DEC realization.

$$L = \frac{(F + v_s)(T_1 + \frac{F - v_s}{A} - T_1 + T_3) + (F + v_e)(T_5 + \frac{F - v_e}{A} - T_5 + T_7)}{2}$$
$$= \frac{(F + v_s)(\frac{\pi}{2J}A + \frac{F - v_s}{A}) + (F + v_e)(\frac{\pi}{2J}A + \frac{F - v_e}{A})}{2}$$
$$= \frac{2F^2 + F\frac{\pi A^2}{J} + v_s\frac{\pi A^2}{2J} + v_e\frac{\pi A^2}{2J} - v_s^2 - v_e^2}{2A}$$
(24)

$$F = \begin{cases} V_f & \text{if } L > L_{med} \\ \frac{-\frac{\pi A^2}{J} + \sqrt{(\frac{\pi A^2}{J})^2 - 8(v_s \frac{\pi A^2}{2J} + v_s \frac{\pi A^2}{2J} + v_e \frac{\pi A^2}{2J} - v_s^2 - v_e^2 - 2AL)}{4} & \text{if } L > L_{med} \\ \min(v_s, v_e) & \text{if } L < L_{min} \end{cases}$$
(29)

4.2.3 The criterion length L_{\min}

The criterion length derivation process will be given as follows:

According to Eq.14, we have

$$F = v_3 = v_s + \frac{A}{2}T_1 + AT_2 + \frac{A}{2}T_3$$
(30)

where $T_1 = T_3 = T_5 = T_7 = \frac{\pi A}{2J} > 0$, and $T_2 \ge 0$ Then:

$$F = v_s + \frac{A}{2}T_1 + AT_2 + \frac{A}{2}T_3 \ge v_s + AT_1 = v_s + A\frac{\pi A}{2J}$$
(31)

According to Eq. 28, we can get

$$F = \frac{-b + \sqrt{b^2 - 4ac}}{2a} \ge v_s + \frac{\pi A^2}{2J}$$
(32)

where $a = 2, b = \frac{\pi A^2}{J}, c = v_s \frac{\pi A^2}{2J} + v_s \frac{\pi A^2}{2J} + v_e \frac{\pi A^2}{2J} - v_s^2 - v_e^2 - 2AL$

Substituting temporary variables a, b, and c into Equ.32 gives the following inequality

$$L \ge \frac{2\left(v_{s} + \frac{3\pi A^{2}}{4J}\right)^{2} - \left(v_{s} - \frac{\pi A^{2}}{4J}\right)^{2} - \left(v_{e} - \frac{\pi A^{2}}{4J}\right)^{2}}{2A} \quad (33)$$

Please refer to Appendix **B** for the detailed derivation process.

Thus, the criterion length L_{\min} can be represented as

$$L_{\min} = \frac{2\left(v_s + \frac{3\pi A^2}{4J}\right)^2 - \left(v_s - \frac{\pi A^2}{4J}\right)^2 - \left(v_e - \frac{\pi A^2}{4J}\right)^2}{2A}$$
(34)

The criterion lengths are given by

$$\begin{cases} L_{med} = \frac{(V_f + v_s)(T_1 + T_2 + T_3) + (V_f + v_e)(T_5 + T_6 + T_7)}{2} \\ L_{min} = \frac{2\left(v_s + \frac{3\pi A^2}{4J}\right)^2 - \left(v_s - \frac{\pi A^2}{4J}\right)^2 - \left(v_e - \frac{\pi A^2}{4J}\right)^2}{2A} \end{cases}$$
(35)

C. ACCELERATION AND DECELERATION REALIZATION

As shown in Fig.3, the confined curvature k_c of the NURBS curve is calculated by substituting the commanded velocity V_f into Eq. 13. Then, the curvature-sensitive regions of the NURBS curve are naturally partitioned by the confined curvature, and the local curvature extreme points can be found as the critical points for each curvature-sensitive area. Finally, the NURBS curve is segmented by critical points, and each curve segment can be expressed as $(u_s, u_e, v_s, v_e, l_i)$.

After that, the interpolator cyclically scans the segmented curve feature vector until all curve segments are processed. Firstly, the acceleration and deceleration of the curve segment are determined by comparing the segment length with the length of the confined curve segment. If $l_i > L_{med}$, the curve segment is long enough to belong to the long curve segment and will contain all 7 phases of the jerk-continuous method, and the feedrate can reach the command velocity. If $L_{min} \leq l_i \leq L_{med}$, the curve segment belongs to the type of medium segment, the feedrate cannot reach the command velocity, and the actual maximum velocity F should be calculated according to Eq. 28. If $l_i \leq L_{min}$, the curve segment belongs

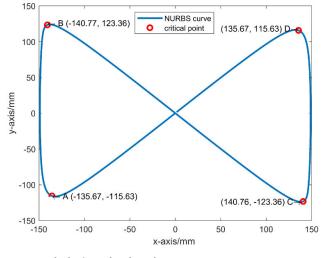


FIGURE 4. The horizontal-8-shaped NURBS curve.

to the short segment, while the jerk and acceleration cannot reach the maximum value. The minimum feedrate at both ends of the short segment will be kept constant throughout the short curve segment interpolation to reduce the processing complexity.

Now, the actual feedrate can be calculated. For both long and medium curve segments, the displacements of the remaining uninterpolated curve segment are first calculated, and the stage in which the acceleration and deceleration of the current interpolation point is located is determined based on the remaining displacements. If $L_r > s_{acc} +$ s_{dec} , the velocity v(t) at this point should gradually increase to the end velocity, which should be calculated according to Eq.13. If $s_{dec} \leq L_r \leq s_{acc} + s_{dec}$, it indicates that the velocity of the current interpolation point belongs to the constant velocity phase, while the feedrate v(t) should be maintained at the maximum velocity F of the curve segment. If $L_r < s_{dec}$, it indicates that the velocity of the current interpolation point belongs to the acceleration decreasing stage, while the velocity v(t) at this point should gradually decelerate to the endpoint velocity, which should be calculated according to Eq.13. Besides, for the short segment, the velocity should be maintained at a constant velocity, smaller than the velocity between the beginning and end points.

So far, the feedrate can be obtained for three different curve segments at any interpolation cycle. The parameter u_{i+1} can be calculated from Eq.8.

V. SIMULATION AND ANALYSIS

As shown in Fig. 4 and Fig. 6, horizontal-8-shaped and butterfly-shaped NURBS curves are simulated to verify the effectiveness of the proposed method. Appendix C lists the parameters for the two typical curves, such as degrees, control points, and weight. The interpolation parameters for the simulation are given in Table 2.

Parameters	Symbol	Units
Command feedrate	$V_{ m f}$	2×10^{-1} mm/ms
Maximum normal ACC	a_{n}	$1 \times 10^{-3} \text{ mm/ms}^2$
Maximum normal jerk	$j_{ m n}$	1×10 ⁻⁴ m/ms ³
Maximum tangential ACC	$A_{ m t}$	$1 \times 10^{-3} \text{ mm/ms}^2$
Maximum tangential jerk	$J_{ m t}$	$1 \times 10^{-4} \text{ mm/ms}^3$
Maximum chord error	$\delta_{ m max}$	1×10 ⁻³ mm
Maximum contour error	\mathcal{E}_{max}	5×10 ⁻² mm
Interpolation priod	Т	$2 \times 10^{-3} s$

TABLE 2. The interpolation parameters for the simulation.

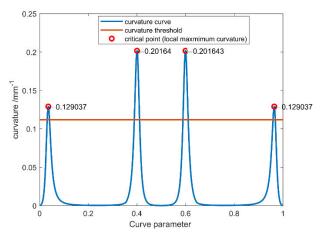


FIGURE 5. The curvature and the critical points of the horizontal-8-shaped NURBS curve.

A. SIMULATION ANALYSIS OF THE HORIZONTAL-8-SHAPED NURBS CURVE

As shown in Fig.4, the curve is divided into four segments by four critical points, marked with A, B, C, and D. Critical points on the curve are marked with "o", and their corresponding coordinate values are displayed next to them. The parameter information of the curve segments is shown in Table 3. Fig. 5 shows the curvature corresponding to the horizontal-8-shaped curve. It can be seen that there are four abrupt change areas in the curvature of the curve, each of which represents a curvature-sensitive region. The confined curvature k_c can be obtained by substituting the parameters in Table 2 into Eq.10. The confined curvature is finally calculated as $k_c = 0.112$. This confined curvature is represented by a line parallel to the x-axis in Fig. 5, marked as the curvature threshold, and divides the horizontal-8-shaped curve into four curvature-sensitive regions with curvature higher than the portion above the confined curvature line. The local curvature maximum point of each curvature-sensitive area is regarded as a critical point and marked as "o", which corresponds to the critical point in Fig. 4. The number next to each critical point in Fig.5 represents the point curvature.

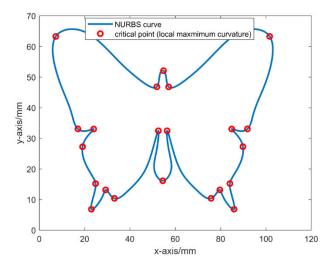


FIGURE 6. The butterfly-shaped NURBS curve.

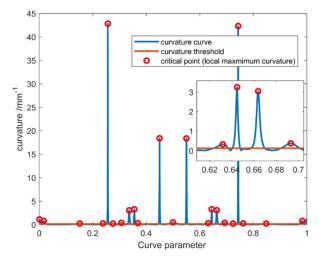


FIGURE 7. The curvature and the critical points of the butterfly-shaped NURBS curve.

The simulation results of the proposed method are shown in Figs.8-15. The proposed method's velocity and tangential acceleration/jerk are well confined to the maximum values. At the same time, the tangential acceleration profile and tangential jerk profile are continuous, indicating that the velocity is smooth naturally. Fig. 11 shows that the chord error is always kept below the maximum chord error during the interpolation, indicating a high machining accuracy. The normal acceleration and normal jerk are also involved in the simulation, as shown in Figs.12-13, and the results indicate that both metrics are within the maximum range. In particular, the normal jerk is significantly lower than the maximum normal jerk. The influence of contour error is also considered in the simulation, and the simulation results are shown in Fig. 14. The results show that the method can well limit the contour error throughout the interpolation process, which is several orders of magnitude smaller than the maximum allowable contour error.

SN of the segments	Parameters $(u_s, u_e, v_s, v_e, l_i)$	Max velocity(mm/ms)	Types(L:long,M:midum,S: short)
SO	$(u_s = 0.000 \ u_e = 0.036 \ v_s = 0.000 \ v_e = 0.088 \ l_0 = 180.735)$	0.2	L
S 1	$(u_s = 0.036 \ u_e = 0.400 \ v_s = 0.088 \ v_e = 0.070, \ l_1 = 243.730)$	0.2	L
S2	$(u_s = 0.400 \ u_e = 0.600 \ v_s = 0.088 \ v_e = 0.070, \ l_2 = 378.608)$	0.2	L
S3	$(u_s = 0.600 \ u_e = 1.000 \ v_s = 0.070 \ v_e = 0.000, \ l_3 = 243.764)$	0.2	L

TABLE 3. Segments of the horizontal-8-shaped curve.

TABLE 4. Segments of the butterfly-shaped curve.

SN of the segments	Parameters (a_1, a_2, a_3, a_4)	Max velocity(mm/ms)	Types(L:long,M:midum,S:short)
	$(u_s, u_e, v_s, v_e, l_i)$	0.017	М
$S_0 \\ S_1$	$(u_s = 0.000 \ u_e = 0.001 \ v_s = 0.000 \ v_e = 0.030 \ l_0 = 0.344)$ $(u_s = 0.001 \ u_e = 0.017 \ v_s = 0.030 \ v_e = 0.036 \ l_1 = 6.103)$	0.074	М
S_1 S_2	$(u_s = 0.001 \ u_e = 0.017 \ v_s = 0.036 \ v_e = 0.058 \ l_1 = 6.103)$ $(u_s = 0.017 \ u_e = 0.152 \ v_s = 0.036 \ v_e = 0.068 \ l_2 = 50.678)$	0.2	L
S_2 S_3	$(u_s = 0.057 \ u_e = 0.132 \ v_s = 0.058 \ v_e = 0.068 \ l_2 = 33.200)$ $(u_s = 0.152 \ u_e = 0.238 \ v_s = 0.068 \ v_e = 0.062 \ l_3 = 33.200)$	0.183	М
S_3 S_4	$(u_s = 0.132 \ u_e = 0.238 \ v_s = 0.062 \ v_e = 0.005 \ l_4 = 7.142)$	0.085	М
S_4 S_5	$(u_s = 0.256 \ u_e = 0.275 \ v_s = 0.005 \ v_e = 0.071 \ l_5 = 7.737)$	0.091	М
S_{6}	$(u_s = 0.275 \ u_e = 0.307 \ v_s = 0.071 \ v_e = 0.052 \ l_6 = 13.757)$	0.122	М
S_7	$(u_s = 0.307 \ u_e = 0.336 \ v_s = 0.052 \ v_e = 0.018 \ l_7 = 8.731)$	0.091	М
S_8	$(u_s = 0.336 \ u_e = 0.355 \ v_s = 0.018 \ v_e = 0.018 \ l_s = 9.295)$	0.089	М
$\overset{\circ}{S_8}$	$(u_s = 0.355 \ u_e = 0.368 \ v_s = 0.018 \ v_e = 0.057 \ l_0 = 4.824)$	0.070	М
S_9	$(u_s = 0.368 \ u_e = 0.450 \ v_s = 0.057 \ v_e = 0.007 \ l_g = 31.123)$	0.172	М
S_{10}^{-1}	$(u_s = 0.450 \ u_e = 0.500 \ v_s = 0.007 \ v_e = 0.046 \ l_{10} = 18.485)$	0.131	М
S_{11}^{10}	$(u_s = 0.500 \ u_e = 0.551 \ v_s = 0.046 \ v_e = 0.007 \ l_{11} = 18.502)$	0.131	М
S_{12}^{11}	$(u_s = 0.551 \ u_e = 0.632 \ v_s = 0.007 \ v_e = 0.057 \ l_{12} = 31.115)$	0.172	Μ
S_{13}	$(u_s = 0.632 \ u_e = 0.645 \ v_s = 0.057 \ v_e = 0.018 \ l_{13} = 4.827)$	0.018	Μ
S_{14}	$(u_s = 0.645 \ u_e = 0.664 \ v_s = 0.018 \ v_e = 0.018 \ l_{14} = 9.303)$	0.089	М
S_{15}	$(u_s = 0.664 \ u_e = 0.693 \ v_s = 0.018 \ ve = 0.052 \ l_{15} = 8.716)$	0.091	Μ
S_{16}	$(u_s = 0.693 \ u_e = 0.725 \ v_s = 0.052 \ v_e = 0.071 \ l_{16} = 13.744)$	0.121	М
$S_{_{17}}$	$(u_s = 0.725 \ u_e = 0.744 \ v_s = 0.071 \ v_e = 0.005 \ l_{17} = 7.757)$	0.091	М
S_{18}	$(u_s = 0.744 \ u_e = 0.762 \ v_s = 0.005 \ v_e = 0.063 \ l_{18} = 7.203)$	0.085	М
$S_{_{19}}$	$(u_s = 0.762 \ u_e = 0.848 \ v_s = 0.063 \ v_e = 0.068 \ l_{19} = 33.126)$	0.183	М
S_{20}	$(u_s = 0.848 \ u_e = 0.983 \ v_s = 0.068 \ v_e = 0.036 \ l_{20} = 50.712)$	0.2	L
S_{21}	$(u_s = 0.983 \ u_e = 1.000 \ v_s = 0.036 \ v_e = 0.000 \ l_{21} = 6.435)$	0.075	М

Besides, Fig.15 shows the velocity planning results using the jerk-continuous method for the long type segment. The horizontal-8-shaped test curve is divided into four long curve segments. Therefore, the paper intercepts one long segment.

The long curve segment parameters are $(u_s = 0.036, u_e = 0.400, v_s = 0.088 mm/ms, v_e = 0.070 mm/ms, l_i = 243.73 mm$). As shown in Fig. 15a, the curvature of the tested curve segment is high at both ends and low in the middle.

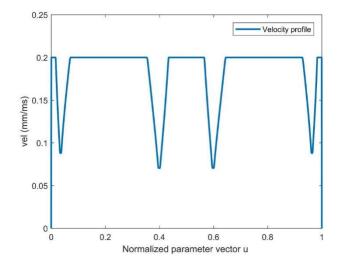


FIGURE 8. The velocity simulation result of the horizontal-8-shaped NURBS curve.

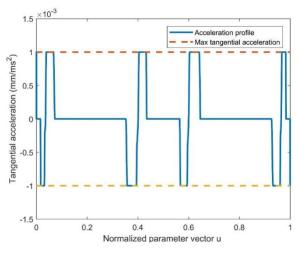


FIGURE 9. The tangential acceleration simulation result of the horizontal-8-shaped NURBS curve.

Fig. 15b shows the scheduled velocity profile, including three stages of acceleration, constant velocity, and deceleration, while the velocity profile changes continuously. Fig.15c and Fig. 15d show the corresponding tangential acceleration and jerk curves, all within the maximum allowable value range of the system, and meet the continuous characteristics of a jerk. At the same time, Fig. 15e and Fig. 15f show that the normal acceleration and normal jerk also meet the tolerance. Significantly, the change of the normal jerk is well limited, further reducing the vibration in the normal direction. The chord and contour errors of the curve segment under the jerkcontinuous method are shown in Fig. 15g and Fig. 15h. The chord error generally meets the maximum allowable error requirements, the chord error value at the beginning and end of the curve segment is high, with smaller values in the middle part. The contour error is several orders of magnitude smaller than the maximum allowable error, indicating that the machining accuracy can be well guaranteed.

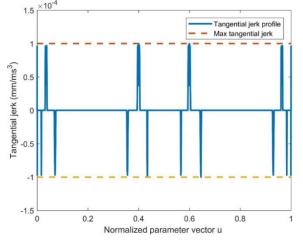


FIGURE 10. The tangential jerk simulation result of the horizontal-8-shaped NURBS curve.

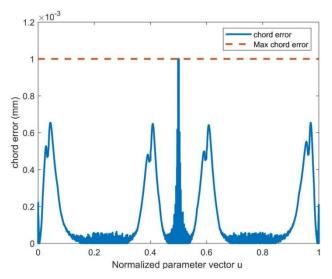


FIGURE 11. The chord error simulation result of the horizontal-8-shaped NURBS curve.

B. SIMULATION ANALYSIS OF THE BUTTERFLY-SHAPED NURBS CURVE

The simulation results of the butterfly-shaped NURBS curve are shown in Fig. 6, while the critical points on the curve are marked with 'o'. The thresholds of the medium segment L_{med} and short segment L_{min} are 42.922mm and 0.274mm, respectively, which can be calculated by Eq.39. Next, the curve can be divided into 22 segments according to the threshold, of which 2 are long segments and 20 medium segments. Table 4 shows the detailed parameters of each curve segment. The curvature of the butterfly-shaped NURBS curve is listed in Fig. 7. The right middle area in Fig. 7 is a partially enlarged view, indicating some details that are not apparent in the small scaling. The sharp corners with larger curvature are the curvature-sensitive regions in Fig.7. Each curvature-sensitive area's maximum local curvature point is regarded as a critical point and marked as "o",

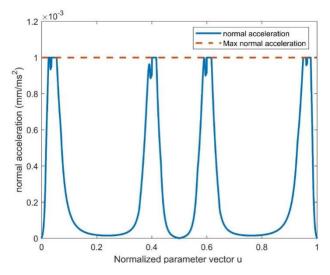


FIGURE 12. The normal acceleration simulation result of the horizontal-8-shaped NURBS curve.

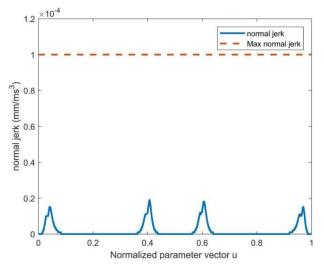


FIGURE 13. The normal jerk simulation result of the horizontal-8-shaped NURBS curve.

which corresponds to the critical point in Fig. 6. Compared with the horizontal 8-shaped curve, the butterfly-shaped curve is divided into more curve segments, and the feedrate scheduling is more difficult.

The simulation results of the proposed method are shown in Figs.16-22. According to the simulation results of the horizontal 8-type curve, Figs. 16-18 show that the proposed method's velocity, tangential acceleration, and tangential jerk values are limited to the maximum values. At the same time, it is clear that the tangential acceleration and jerk profiles are continuous, indicating that the velocity is smooth naturally. The normal acceleration and jerk are always kept below the maximum value in Figs.19-20. The influence of chord and contour errors are also considered in the simulation, and the simulation results are shown in Figs.21-.22. The results indicate that the proposed method can well limit the chord and contour errors in the whole interpolation process.

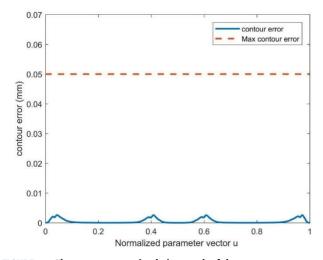


FIGURE 14. The contour error simulation result of the horizontal-8-shaped NURBS curve.

TABLE 5. Comparison of butterfly-shaped curve simulation results.

Interpolatio n methods	Maximum chord error (mm)	Maximum contour error (<i>mm</i>)	Computatio nal time (us)	Interpolatio n time (s)
JCFS	1.000e-3	5.700e-3	658.36	8.712
Proposed	(\$23.7%)	(↓17.2%)	(\14.7%)	(↓22.8%)
DICT in [16]	1.31e-3	4.862e-2	771.54	11.29
CSFA in [38]	4.819e-2	2.592e-1	-	5.547
DBLA in [39]	3.75e-2	3.450e-1	-	5.397

At the same time, to better observe the simulation results, the results of one curve segment are taken from each of the two types of 22-segment curve segments for display. As shown in Fig. 23, the curve segment is long, corresponding to s2 in Table 4. The detailed parameters of the curve segment can be found in the s2 item. Fig. 23 shows that the acceleration and deceleration processes include seven phases, and the maximum velocity can reach the command velocity. As shown in Fig. 23a, the curvature of the tested curve segment is high at both ends and low in the middle. Fig. 23b shows the feedrate scheduled profile, including three stages of acceleration, constant velocity, and deceleration, while the velocity profile changes continuously. Fig. 23c and Fig. 23d show the corresponding tangential acceleration and jerk curves, all within the maximum allowable value range of the system, and meet the continuous characteristics of the jerk. Fig. 23e and Fig. 23f show that the normal acceleration and jerk also meet the tolerance, especially the change of the normal jerk is well limited. As shown in Fig. 23g and Fig. 23h, the chord and contour errors are also limited.

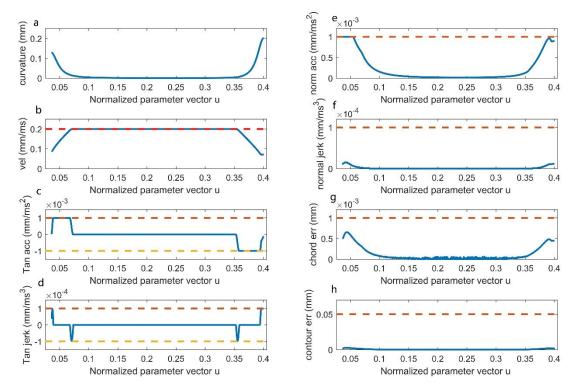


FIGURE 15. The simulation results of the long-length type curve segment of the horizontal-8-shaped NURBS curve. a Curvature. b Scheduled velocity. c Tangential acceleration. d Tangential jerk. e Normal acceleration. F Normal Jerk. g Chord error. h Contour error.

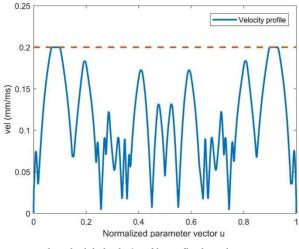


FIGURE 16. The scheduled velocity of butterfly-shaped NURBS curve.

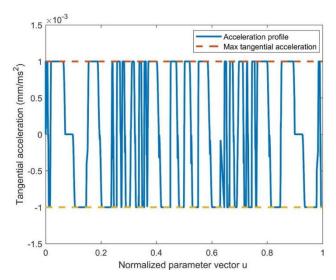


FIGURE 17. The tangential acceleration profile of butterfly-shaped NURBS curve.

Besides, the s12 segment in Table 4 is taken for further discussion, which belongs to the medium segment. Since the length of the curve segment is not enough to accelerate to the commanded velocity, the difference from s2 is inevitable. Besides, the feedrate planning process is somewhat different from that in Fig.23. The most important thing is that the velocity profile does not have a constant velocity phase, and the maximum velocity is less than the command velocity, as shown in Fig. 24b. However, from the simulation results

of tangential acceleration and jerk, normal acceleration and jerk, chord and contour errors, the design requirements can be met.

In order to evaluate the effectiveness of the proposed method, it is compared with a double interpolation algorithm based on the cosine theorem (DICT) [16], a complete S-shape feedrate scheduling approach (CSFA) [38], and a dynamic-based interpolator with real-time look-ahead

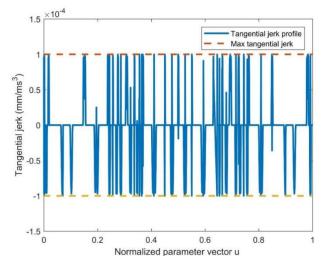


FIGURE 18. The tangential jerk profile of butterfly-shaped NURBS curve.

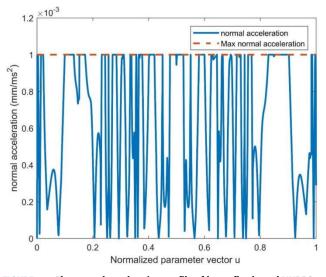


FIGURE 19. The normal acceleration profile of butterfly-shaped NURBS curve.

algorithm (DBLA) [39]. Several parameters are compared, such as maximum chord error, maximum contour error, computational time [16], and interpolation time. Table 5 shows that although DBLA and CSFA methods consume less computational time than DICT and the proposed method, their maximum chord and contour errors are higher than DICT and the proposed method. Using DICT as the benchmark, the proposed method reduces the maximum chord and contour errors by 23.7% and 17.2%, respectively. The proposed method can achieve the best accuracy and surface quality compared with other methods. At the same time, the computational time of the proposed method is about 658.36us for NURBS curve interpolation, which is 14.7% lower than that of DICT, which can better meet the realtime interpolation period (2ms) requirement. Moreover, the interpolation time is 8.712s, which is 22.8% lower than that of DICT, providing a better processing efficiency. The proposed

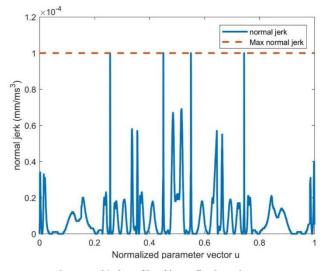


FIGURE 20. The normal jerk profile of butterfly-shaped NURBS curve.

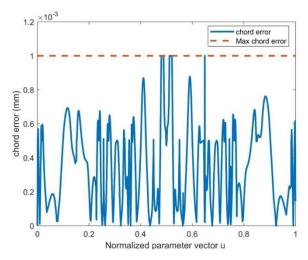


FIGURE 21. The chord error of butterfly-shaped NURBS curve.

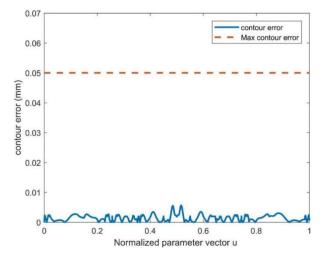


FIGURE 22. The contour error of butterfly-shaped NURBS curve.

method significantly reduces the computational overhead and improves the processing quality.

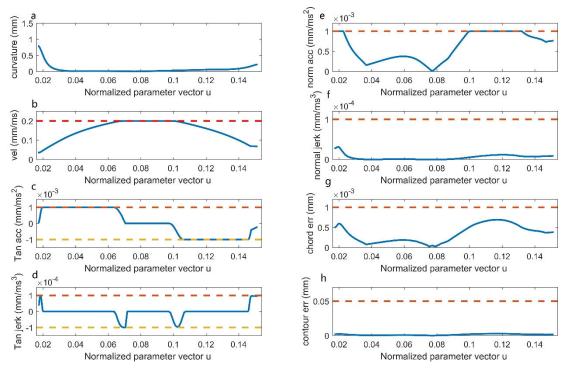


FIGURE 23. The simulation results of the long-length type curve segment of the butterfly-shaped NURBS curve. a Curvature. b Scheduled velocity. c Tangential acceleration. d Tangential jerk. e Normal acceleration. f Normal Jerk. g Chord error. h Contour error.

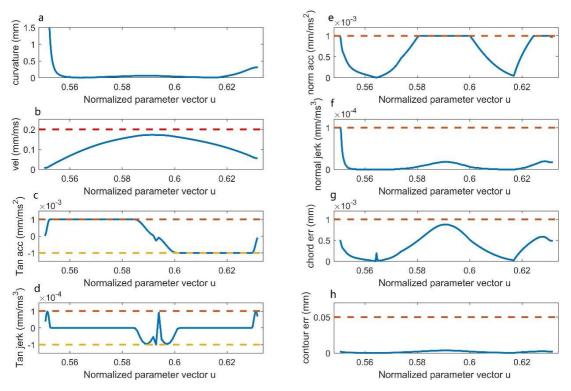


FIGURE 24. The simulation results of the medium-length type curve segment of the butterfly-shaped NURBS curve. a Curvature. b Scheduled velocity. c Tangential acceleration. d Tangential jerk. e Normal acceleration. f Normal Jerk. g Chord error. h Contour error.

The simulation results indicate that the proposed method has reached the expectation in all aspects for more complex butterfly-shaped curves, demonstrating the feasibility and effectiveness of the proposed method.

C. BRIEF DISCUSSION ON THE JERK LIMITATION

The proposed method considers the normal and tangential jerk limitations during interpolation. The proposed method obtains the confined curvature through maximum chord error, maximum contour errors, maximum normal acceleration and normal jerk and obtains the curvature-sensitive areas. The above parameters (including the maximum normal jerk) restrict the feedrate of each point in the curvature-sensitive area so that the maximum normal jerk tolerance can be met at any time during the interpolation process, as shown in Fig. 13 and Fig. 20. At the same time, the trigonometric-function-based jerk-continuous method is utilized to confine the tangential jerk, so that the tangential jerk meets the maximum tangential jerk tolerance and maintains the continuity of the tangential jerk everywhere, as shown in Fig. 10 and Fig. 18.

However, there are some differences in different interpolation curves, such as the simulated horizontal-8-shaped NURBS and butterfly-shaped NURBS curves. Since the curvature profile of the former curve is much lower than that of the latter, as shown in Fig. 5 and Fig. 7, the actual normal jerk profile of the former is much lower than the maximum normal jerk tolerance (as shown in Fig. 13). In contrast, the actual normal jerk profile of the latter is larger than the former in terms of the fluctuation range and amplitude (as shown in Fig. 20). In terms of a tangential jerk, since the former has fewer curvature sensitive areas than the latter, the change in the actual tangential jerk profile of the former is simpler than that of the latter (as shown in Fig. 10 and Fig. 18).

VI. CONCLUSION

In this paper, a jerk-continuous feedrate optimization method is proposed. Firstly, the entire trajectory is subdivided into segments based on the curve segmentation idea. Then, curve segment classification and threshold length calculation methods are constructed to reduce the complexity of feedrate optimization. Next, the analytic expression of the maximum achievable feedrate for different-length curve segments is also established. Finally, two typical horizontal-8-shaped and butterfly-shaped NURBS curves are simulated. The results indicate that the chord and contour errors can be kept within the given tolerance. Besides, the values of normal acceleration/jerk and tangential acceleration/jerk are confined to match the machine tool's dynamic capabilities. Compared with the DICT method, the computational and interpolation time are reduced by 17.2% and 22.8%, respectively, demonstrating the method's feasibility and effectiveness. Further research should be performed to apply the proposed method to five-axis machine tools, which will face more significant challenges.

APPENDIX A

$$2F^{2} + F\frac{\pi A^{2}}{J} + v_{s}\frac{\pi A^{2}}{2J} + v_{e}\frac{\pi A^{2}}{2J} - v_{s}^{2} - v_{e}^{2} - 2AL = 0$$

Let $a = 2, b = \frac{\pi A^{2}}{J}, c = v_{s}\frac{\pi A^{2}}{2J} + v_{s}\frac{\pi A^{2}}{2J} + v_{e}\frac{\pi A^{2}}{2J} - v_{s}^{2} - v_{e}^{2} - 2AL$
2AL

TABLE 6. The horizontal-8-shaped curve parameters.

Parameters	Values	
Control	$\{0,0\},\{-150,-150\},\{-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{150,-150,150\},\{0,0\},\{0,0\},\{150,-150,150\},\{0,0\},\{0$	
Points	150 , {150, 150}, {0,0}	
Weights	{1,25,25,1,25,25,1};	

TABLE 7. The parameters of the butterfly-shaped curve.

Parameters	Values
Control	{54.493, 52.139}, {55.507, 52.139}, {56.082,
Points	49.615},{56.780, 44.971}, {69.575, 51.358}, {77.786,
	58.573 , {90.526, 67.081}, {105.973, 63.801}, {100.400,
	47.326}, {94.567, 39.913}, {92.369, 30.485}, {83.440,
	33.757},
	$\{91.892, 28.509\}, \{89.444, 20.393\}, \{83.218,$
	15.446 , { 87.621 , 4.830}, { 80.945 , 9.267}, { 79.834 ,
	14.535 , {76.074, 8.522}, {70.183, 12.550}, {64.171,
	16.865 , {59.993, 22.122}, {55.680, 36.359}, {56.925,
	24.995},
	$\{59.765, 19.828\}, \{54.493, 14.940\}, \{49.220,$
	19.828 , { 52.060 , 24.994 }, { 53.305 , 36.359 }, { 48.992 ,
	22.122},{44.814, 16.865}, {38.802, 12.551}, {32.911,
	8.521},{29.152, 14.535}, {28.040, 9.267}, {21.364,
	4.830},
	$\{25.768, 15.447\}, \{19.539, 20.391\}, \{17.097,$
	28.512},{25.537, 33.750}, {16.602, 30.496}, {14.199,
	39.803 , { 8.668 , 47.408}, { 3.000 , 6 3.794 }, { 18.465 ,
	67.084},{31.197, 58.572}, {39.411, 51.358}, {52.204,
	44.971},
	{52.904, 49.614}
	, {53.478, 52.139}, {54.493, 52.139}
Weights	$\{0, 0, 0, 0, 0.0083, 0.0150, 0.0361, 0.0855, 0.1293,$
	0.1509, 0.1931, 0.2273, 0.2435, 0.2561, 0.2692, 0.2889,
	0.3170, 0.3316, 0.3482, 0.3553, 0.3649, 0.3837, 0.4005,
	0.4269, 0.4510, 0.4660, 0.4891, 0.5000, 0.5109, 0.5340,
	0.5489, 0.5731, 0.5994, 0.6163, 0.6351, 0.6447, 0.6518,
	0.6683, 0.6830, 0.7111, 0.7307, .7439,0.7565, 0.7729,
	0.8069, 0.8491, 0.8707, 0.9145, 0.9639, 0.9850, 0.9917,
	1.0, 1.0, 1.0, 1.0;
knot vector	$\{1.0, 1.0, 1.0, 1.2, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0$
	1.0, 5.0, 3.0, 1.0, 1.1, 1.0, 1.0, 1.0, 1.0, 1.0, 1
	1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.1, 1.0, 3.0, 5.0, 1.0, 1.0,
	2.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1

The quadratic equation for F can be described as:

$$\begin{split} aF^2 + bF + c &= 0\\ \Delta &= b^2 - 4ac\\ &= (\frac{\pi A^2}{J})^2 - 4 * 2 * (v_s \frac{\pi A^2}{2J} + v_e \frac{\pi A^2}{2J} - v_s^2 - v_e^2 - 2AL)\\ &= \frac{\pi^2 A^4}{J^2} - 8(v_s (\frac{\pi A^2}{2J} - v_s) + v_e (\frac{\pi A^2}{2J} - v_e)) + 16AL\\ &= 8(v_s^2 - \frac{1}{2}v_s \frac{\pi A^2}{J}) + 8(v_e^2 - \frac{1}{2}v_e \frac{\pi A^2}{J}) + \frac{\pi^2 A^4}{J^2} + 16AL\\ &= 8(v_s^2 - \frac{1}{2}v_s \frac{\pi A^2}{J} + \frac{\pi^2 A^4}{16J^2}) \end{split}$$

$$\Rightarrow -8(v_s(AT_1 - v_s) + v_e(AT_5 - v_e) - 2AL) \ge 16(v_s + \frac{\pi A^2}{2J})^2 + 8A(T_1 + T_5)(v_s + \frac{\pi A^2}{2J})$$

$$\Rightarrow 16AL \ge 16(v_s + \frac{\pi A^2}{2J})^2 + 8A(T_1 + T_5)(v_s + \frac{\pi A^2}{2J}) + 8(v_s(AT_1 - v_s) + v_e(AT_5 - v_e))$$

$$\Rightarrow L \ge \frac{(v_s + \frac{\pi A^2}{2J})^2 + \frac{1}{2}A(\frac{\pi A}{2J} + \frac{\pi A}{2J})(v_s + \frac{\pi A^2}{2J})}{A} + \frac{(v_s(AT_1 - v_s) + v_e(AT_5 - v_e))}{2A}$$

$$\Rightarrow L \ge \frac{(v_s + \frac{\pi A^2}{2J})^2 + \frac{1}{2}A(\frac{\pi A}{2J} + \frac{\pi A}{2J})(v_s + \frac{\pi A^2}{2J})}{A} + \frac{(v_s(A\frac{\pi A}{2J} - v_s) + v_e(A\frac{\pi A}{2J} - v_e))}{2A}$$

$$\Rightarrow L \ge \frac{(v_s + \frac{\pi A^2}{2J})^2 + \frac{1}{2}\frac{\pi A^2}{J}(v_s + \frac{\pi A^2}{2J}) + (\frac{\pi A^2}{4J})^2 - (\frac{\pi A^2}{4J})^2}{A} - \frac{(v_s - \frac{\pi A^2}{2J} + (\frac{\pi A^2}{4J})^2 - (\frac{\pi A^2}{4J})^2)}{A} + (v_s - \frac{\pi A^2}{4J})^2 - (\frac{\pi A^2}{4J})^2 - (\frac{\pi$$

$$+8(v_e^2 - \frac{1}{2}v_e\frac{\pi A^2}{J} + \frac{\pi^2 A^4}{16J^2}) + 16AL$$

= $8(v_s - \frac{1}{4}\frac{\pi A^2}{J})^2 + 8(v_e - \frac{1}{4}\frac{\pi A^2}{J})^2 + 16AL$

APPENDIX B

$$\frac{-b + \sqrt{b^2 - 4ac}}{2a} \ge v_s + \frac{\pi A^2}{2J}$$

$$\Rightarrow \sqrt{b^2 - 4ac} \ge 2a(v_s + \frac{\pi A^2}{2J}) + b$$

$$\Rightarrow b^2 - 4ac \ge 4a^2(v_s + \frac{\pi A^2}{2J})^2 + 4ab(v_s + \frac{\pi A^2}{2J}) + b^2$$

$$\Rightarrow -4ac \ge 4a^2(v_s + \frac{\pi A^2}{2J})^2 + 4ab(v_s + \frac{\pi A^2}{2J})$$

where a = 2, $b = \frac{\pi A^2}{J}$, $c = v_s \frac{\pi A^2}{2J} + v_s \frac{\pi A^2}{2J} + v_e \frac{\pi A^2}{2J} - v_s^2 - v_e^2 - 2AL$, then the equation can be derived, as shown at the top of the page.

APPENDIX C

See Table 6 and 7.

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MINGXING NIE received the bachelor's degree in computer science, the master's degree in computer system structure, and the Ph.D. degree in traffic information engineering and control from Central South University, Hunan, China, in 2004, 2007, and 2015, respectively. He is currently an Associate Professor with the School of Computer Science, University of South China. His current research interests include computer numerical control, NURBS interpolation, optimization technique, motor control, and the IoT.



LIWEI ZOU received the bachelor's degree in software engineering from Sichuan Normal University, Sichuan, China, in 2022. He is currently pursuing the master's degree in electronic information with the School of Computer Science, University of South China. His current research interests include optimization techniques and the Internet of Things.



TAO ZHU (Member, IEEE) received the B.E. degree from Central South University, in 2009, and the Ph.D. degree from the University of Science and Technology of China, in 2015. He was a Post-doctoral Researcher and a Lecturer with the School of Computer and Communication Engineering, University of Science and Technology Beijing. He is currently an Associate Professor with the University of South China. His research interests include evolutionary computation and the Internet of Things.