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An Anti-Windup Method Based on an LADRC for Miniaturized Inertial Stabilized Platforms on Unmanned Vehicles in Marine Applications

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Abstract: This paper investigates an anticipatory activation anti-windup approach based on Linear Active Disturbance Rejection Control (LADRC) to address the influences of accelerated saturation on the actuators in a Miniaturized Inertial Stabilized Platform (MISP) with extreme external disturbance. The proposed method aims to eliminate the high-frequency vibrations on the Line of Sight (LOS) of electro-optical devices during actuator saturation. To achieve this, the Linear Extended State Observer (LESO) is modified by adding saturation feedback to the total disturbance observed state variable, which is operated as an anticipatory activation anti-windup compensator. The stability of the proposed controller is discussed, and the gains are optimized by the Linear Matrix Inequality (LMI) constraints through quadratic programming and an H-infinite performance indicator. Additionally, as the multiple activated scheme for anti-windup, the effectiveness of immediate activation in dealing with accelerated saturation is compared and analyzed. These comparisons and verification are implemented through simulations, where the external disturbance is introduced using recorded attitude data from USV sailing. Finally, experiments are conducted on an MISP for a visual tracking system, demonstrating that the anticipatory activation method effectively suppresses high-frequency vibrations on the LOS during instances of accelerated saturation.

Keywords: robustness control; accelerated saturation; LADRC; quadratic programming; anti-windup; LMI



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1. Introduction

The Miniaturized Inertial Stabilized Platform (MISP) presents extensive application in Unmanned Aerial Vehicles (UAVs) and Unmanned Surface Vehicles (USVs) to stabilize electro-optical devices for high-precision control of the Line of Sight (LOS) [1–5]. This technology is indispensable for performing complex tasks, such as visual-aided autonomous navigation [6–10] and target tracking in coast patrol [11,12]. Moreover, the joint USV-UAV operations [13–16] in marine environments characterized by complex and random disturbances, such as wave motion, turbulence, and environmental gusts, are also required urgently. To meet the requirements of unmanned vehicle applications, researchers have been dedicated to enhancing the performance of the MISP. The modified Kalman filter has been applied in dual-axial MISPs to enhance precision in target tracking for surveying and mapping [17]. Furthermore, the angular signal of an MISP is leveraged to improve navigation precision for obstacle detection and avoidance [18,19]. Refs. [20,21] employed a camera-stabilized gimbal system to track the landmarks for localization and navigation when an autonomous vehicle explores the unknown and GPS signals are denied in the environments. Ref. [22] implemented a dynamic camera for visual-inertial navigation using an MISP, with the parametrization of the actuated mechanism enabling online calibration.

Currently, to meet the requirements of diverse loads for the miniaturized unmanned vehicles, gear-driven actuators with a large torque output are employed in MISPs to adjust

the frame for stabilizing the LOS. However, the actuators experience saturation in angular acceleration during the stabilized control of the LOS when unmanned vehicles operate with high-frequency and large-amplitude external disturbances, such as marine environments. The vibrations caused by accelerated saturation affect the target identification for the visual sensors, particularly when the MISP operates in a low-power condition of the unmanned vehicle. Therefore, the problems in the control system are characterized by high-frequency random disturbances and uncertain conditions; most control strategies are restricted by the demand for the low-cost of the design of the MISP.

Fortunately, the Active Disturbance Rejection Controller (ADRC), proposed in the 1990s by Han and theorized in [23], does not rely on the system model and exhibits a superior performance in addressing uncertain conditions during the control process. Particularly, Gao designed the Linear ADRC (LADRC) by applying the scaling and bandwidth parameterization mentioned in [24], to meet the demands of convenient application, especially when operated on low-cost microchips for designers. In recent years, researchers have utilized a modified ADRC to enhance system performance under nonlinear constraints and actuator saturation. Ref. [25] combines the trajectory linearization control and ADRC for a hypersonic reentry vehicle attitude tracking system, achieving a good performance when overcoming actuator saturation. Refs. [26,27] investigate the use of an ADRC for stabilizing nonlinear systems with actuator saturation and demonstrate that local stabilization can be achieved in a region including the origin. Moreover, modified Extended State Observer (ESO) techniques have been proposed in [28–31] to estimate system states and disturbances simultaneously without a time delay. These techniques are adapted as anti-windup compensators to address input saturation and time delays in actuators. A novel robustness controller for the anti-windup loop has been modified using an improved ESO, which accurately estimates the state and disturbance under Magnitude and Rate Saturation (MRS) conditions, thereby enhancing the stability of uncertain nonlinear systems [32]. The anti-windup ESO is proposed to estimate disturbances under input saturations, demonstrating good performances in both Unmanned Ground Vehicles (UGVs) path-following control [33] and turbofan engine systems [34]. Refs. [35–38] investigate a multiple activated scheme for anti-windup control, which is convenient to be realized in engineering, especially satisfying the low-cost controller for the antenna servo system in uncertain conditions when combined with an LADRC. A robust, adaptive, multistage anti-windup control based on anticipatory activation is developed in [39] to handle input constraint for dynamic-positioning ships and improves the transient performance significantly. Ref. [40] investigates a permanent-type axial-gap-bearing motorless control system, which includes a robust controller combined with disturbance observers and anticipatory activation anti-windup compensator, achieving high-accuracy control for speed tracking. However, the methods mentioned above do not consider situations where the actuator is limited by acceleration. As an unmanned miniaturized device, the performance of the actuator's acceleration is constrained by power supplies and often overlooked by designers. Therefore, an anti-windup LADRC with an anticipatory activation compensator is proposed to address these challenges. The primary contributions of this research could be summarized as follows:

1. Accelerated saturation in gear actuators is proposed for the first time. The model of this phenomenon is developed, and its influence on MISPs is analyzed. To address this problem, an anti-windup method based on an LADRC is proposed. This method can be conveniently implemented in a low-cost system;
2. As part of the multiple activated anti-windup method, the limitations of immediate activations in dealing with accelerated saturation are analyzed. By combining the LESO with saturation feedback, the modified anticipatory activation anti-windup compensator is proposed and verified;
3. The proposed method enhances the robustness of visual tracking by the MISP control system, effectively mitigating the high-frequency vibrations on the LOS induced by accelerated saturation, thereby improving the effectiveness of target identification.

The rest of this paper is organized as follows. In Section 2, the accelerated saturation is modeled and analyzed. In Section 3, the proposed controller is designed and discussed in detail. In Section 4, simulations of the proposed method are implemented based on angular rate tracking for stabilized control. In Section 5, experiments are conducted with a visual stabilized and tracking platform. Finally, the conclusions are presented in Section 6.

2. Model of Accelerated Saturation

The actuator’s acceleration constraint could be represented as an input saturation model, which facilitates the analysis and is addressed by an anti-windup method. This model is expressed as:

$$sat(u) = sign(u)min\{|k_a \cdot u|, a_{max}\} \tag{1}$$

As illustrated in Figure 1, the saturation function, denoted as $sat(u)$, comprises a linear segment with a gain, k_a , and the output is $a = k_a \cdot u$, representing the acceleration of the actuator. Then, a saturation segment with a limitation of a_{max} , corresponding to the input, u_a , represents the maximum absolute value of acceleration.

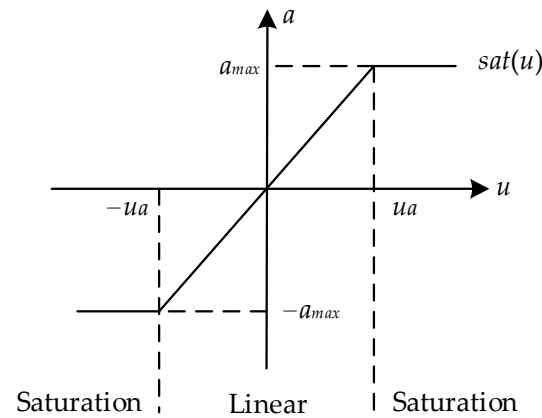


Figure 1. The model of accelerated saturation.

The stabilized control system for the MISP, as illustrated in Figure 2, incorporates the accelerated saturation of the actuator. It operates as an inertial stabilized loop when the input reference, $r = 0$, serves as an inertial tracking loop when r represents the command from the tracking sensors. The input of the controller, $C(s)$, is the error between r and the feedback in the angular rate from the Inertial Measurement Unit (IMU) provided by the transfer function, $H(s)$. The output, $u = E(s)C(s)$, represents the control signal in acceleration and is limited by the saturation function, $sat(u)$, then integrated as the input angular rate order of the actuator. Furthermore, the external disturbance, d , introduced by the motions of the UAV or USV can be compensated for by the stabilized control loop for the LOS.

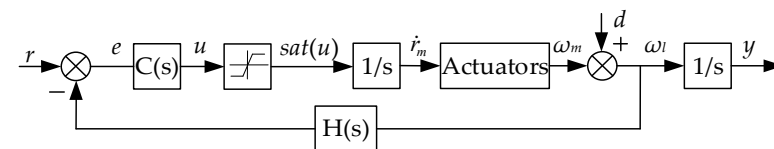


Figure 2. Stabilized control loop with accelerated saturation actuators.

The model of the actuator can be described by Equation (2), where the gain, k_m , represents the relation of the actuator between the input order and rotary output. The gain, k_m , is determined by the gear reducer ratio and the motor’s precision in control. Both the output of the actuator in angle θ_m and angular rate ω_m are related to the input order, r_m , and its

differential value. The output of the controller, u , is constrained by the saturation function, $sat(u)$, which limits the input of the actuator in acceleration denoted as \ddot{r}_m .

$$\begin{cases} \theta_m = k_m r_m \\ \omega_m = k_m \dot{r}_m \\ \ddot{r}_m = sat(u) \end{cases} \quad (2)$$

3. Tracking System with the Anti-Windup LADRC

3.1. Optimal Design for the Anti-Windup LADRC

In the visual tracking control system with actuator saturation, the inertial stabilized platform is considered as a 2-axis-frame control system. Each frame is controlled individually and treated as a Single Input Single Output (SISO) model with second order. Combining the model (2), the single frame control system can be described by Equation (3), where the variable x_1 denotes the angle of the LOS and the variable x_2 denotes the angular rate of the LOS. Additionally, the disturbance of the system is considered and denoted as $f(x_1, x_2, \omega(t), t)$.

$$\begin{cases} \dot{x}_1 = x_2 \\ \dot{x}_2 = f(x_1, x_2, \omega(t), t) + b sat(u) \\ y = x_1 \end{cases} \quad (3)$$

$\omega(t)$ represents the external disturbance angular rate, and the disturbance $f(x_1, x_2, \omega(t), t)$ includes the mechanical deviations and internal influences that cannot be measured. According to the method of LESO as depicted in Equation (4), the uncertain conditions leading to vibrations in the LOS mentioned above can be extended as the state variable x_3 and observed as the total disturbance. The gain $b = \Delta b + b_0$, where Δb is an uncertain factor in the system parameters and is included in x_3 . The state variable, x_3 , also includes the disturbance from saturation.

$$\begin{cases} \dot{x}_1 = x_2 \\ \dot{x}_2 = x_3 + b_0 u \\ \dot{x}_3 = h(x_1, x_2, \omega_{sat}(t), t) \\ y = x_1 \end{cases} \quad (4)$$

To analyze the system using the robustness H -infinity model, let the state vector be represented as $x_p = [x_1, x_2, x_3]^T$, $\omega = [v_1, v_2, h]^T$. The system is expressed in Equation (5).

$$\begin{cases} \dot{x}_p = A_p x_p + B_1 \omega + B_2 u \\ z_p = C_1 x_p + D_{11} \omega + D_{12} u \\ y = C_2 x_p \end{cases} \quad (5)$$

The performance output, denoted as z_p , is designed for a quadratic programming model. Then, the weighted value matrix is designed as shown in Equation (6).

$$A_p = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{bmatrix}, B_1 = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 1 \end{bmatrix}, B_2 = \begin{bmatrix} 0 \\ b_0 \\ 0 \end{bmatrix}, C_1 = \begin{bmatrix} \sqrt{q_1} & 0 & 0 \\ 0 & \sqrt{q_2} & 0 \\ 0 & 0 & \sqrt{q_3} \\ 0 & 0 & 0 \end{bmatrix}, C_2 = [1 \ 0 \ 0], D_{12} = \begin{bmatrix} 0 \\ 0 \\ 0 \\ \sqrt{\rho} \end{bmatrix} \quad (6)$$

Then, the closed-loop system is optimized for the H -infinity tracking performance, leading to the expression $D_{11} = 0$, and defining the constraint condition in Equation (7).

$$\int_0^\infty (q_1 x_1^2 + q_2 x_2^2 + q_3 x_3^2 + \rho u^2) dt < \int_0^\infty \omega^2 dt \quad (7)$$

As stated in Equation (8), the H -infinity norm of the closed-loop transfer function from the disturbance, w , to the performance output, z_p , is constrained to be less than γ .

$$\|T_{\omega z}(s)\|_{\infty} = \sup_{\omega \neq 0} \frac{\|z_p\|_2}{\|\omega\|_2} < \gamma \tag{8}$$

The system is designed to track the input reference while compensating for the total disturbance, including the external disturbance and the effects of accelerated saturations as defined in the vector ω . Additionally, the controller aims to optimize the tracking performance whilst complying with the constraints mentioned during disturbances.

3.2. Tracking Controller with a Modified LESO

As illustrated in Figure 3, we created a visual tracking control system in a single frame for the MISP based on an LADRC with an anti-windup compensator.

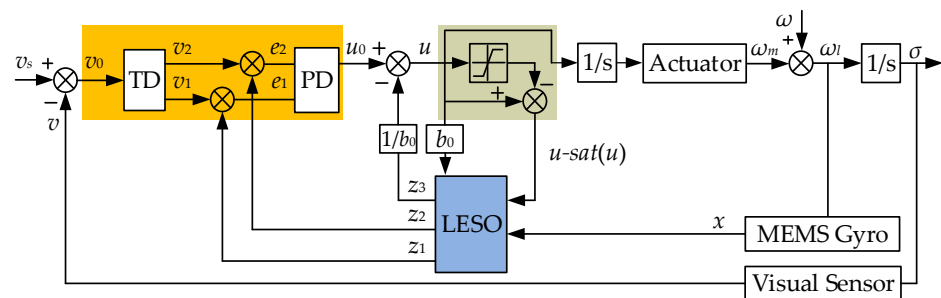


Figure 3. Visual tracking system based on an LADRC with an anti-windup compensator.

The proposed scheme comprises a visual tracking part consisting of a Tracking Differentiator (TD) and Proportional plus Derivative (PD) controller. Then, the stabilized part is implemented by the total disturbance observed variable, denoted as $-z_3/b_0$. As the visual tracking input, v_0 represents the bias of the identified target to the center of the Field of View (FOV); hence, $v_s = 0$. The accelerated saturation of the actuator can introduce nonlinear uncertainties leading to vibrations on the LOS.

To address this issue, an anti-windup method with the modified LESO is proposed, as shown in Equation (9).

$$\begin{cases} \dot{z}_1 = z_2 - l_1 \varepsilon \\ \dot{z}_2 = z_3 - l_2 \varepsilon + b_0 u \\ \dot{z}_3 = -l_3 \varepsilon - j_a q \end{cases} \tag{9}$$

where $q = u - sat(u)$, which represents the feedback of the accelerated saturation for the LESO. The vector $L = [l_1, l_2, l_3]$ is defined as the observer gains to be designed, and the observed errors are defined by the vector $e_r = [e_{r1}, e_{r2}, e_{r3}]^T$, $e_{ri} = z_i - x_i, i = 1, 2, 3$. Then, the observed errors, e_r , can be expressed as:

$$\dot{e}_r = (A_p - LC_2)e_r + D_h \omega + D_q q \tag{10}$$

The matrixes are set as follows:

$$A_p - LC_2 = \begin{bmatrix} -l_1 & 1 & 0 \\ -l_2 & 0 & 1 \\ -l_3 & 0 & 0 \end{bmatrix}, D_h = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & -1 \end{bmatrix}, D_q = \begin{bmatrix} 0 \\ 0 \\ -j_a \end{bmatrix}$$

The total disturbance, f , and the saturation factor, q , are differentiable with respect to t ; it was determined that the observed errors, e_r , are bounded f and q values by designing the system in reality. As can be observed in [24], if the matrix $(A_p - LC_2)$ is Hurwitz, the gain, L , is converted by the positive parameter $\omega_e > 0$, which represents the frequency bandwidth of the LESO, as shown in Equation (11).

$$|sI - (A_p - LC_2)| = (s + \omega_e)^3 = 0 \tag{11}$$

where

$$l_1 = 3\omega_e, l_2 = \omega_e^2, l_3 = \omega_e^3 \tag{12}$$

This can be designed by placing all poles at $-\omega_e$, and additionally confirmed by the condition that the LESO is BIBO stable. When the state variables are observed by the LESO with $e_r \rightarrow 0$, the control signal of the actuator, u , is illustrated in Equation (13). It consists of the output of the tracking part represented by u_0 with gains of k_1 and k_2 and the stabilized part including the compensation for the accelerated saturation in z_3 with the gain b_0 .

$$u = u_0 - z_3/b_0 = k_1(v_1 - z_1) + k_2(v_2 - z_2) - z_3/b_0 \tag{13}$$

3.3. Gains of the System for Robustness in Stability

The saturation feedback, q , can be traded as an adaptation parameter with a gain of j_a . Then, the gains of the controller can be defined as K , which is a matrix with the gains to be adjusted and denoted as $u = Kx_k$. The observed vector of the LESO is denoted as $x_k = [z_1, z_2, z_3]^T$. Then, the controller based on the state variable feedback is designed as Equation (14).

$$\begin{cases} \dot{x}_k = (A_p + B_2K)x_k + B_1\omega \\ z_p = (C_1 + D_{12}K)x_k \end{cases} \tag{14}$$

Then, the constraint condition in the H -infinite norm is represented as (15):

$$\|T_{\omega z}(s)\|_\infty = \|(C_1 + D_{12}K)[sI - (A_p + B_2K)]^{-1}B_1\|_\infty < \gamma \tag{15}$$

The closed-loop system mentioned above is asymptotically stable, and the condition for the H -infinite norm of the transfer function from ω to z_p being less than γ is the existence of a positive definite matrix, $P_1 = P_1^T > 0$, and P_2 satisfying the following conditions:

$$\begin{bmatrix} A_pP_1 + P_1A_p + B_2P_2 + P_2B_2^T + \gamma^{-2}B_1B_1^T & (C_1P_1 + D_{12}P_2)^T \\ C_1P_1 + D_{12}P_2 & -I \end{bmatrix} < 0 \tag{16}$$

The state feedback robust controller is $u = P_2P_1^{-1}x_k$. To facilitate solving using tools, the scalar presented can be transformed following Equation (17):

$$\|T_{\omega z}(s)\|_\infty < \gamma \Leftrightarrow \|\gamma^{-1}T_{\omega z}(s)\|_\infty < 1 \tag{17}$$

Defining $\bar{P}_1 = \gamma^2P_1$, $\bar{P}_2 = \gamma^2P_2$, and the matrix inequality can be transformed into Equation (18):

$$\begin{bmatrix} A_p\bar{P}_1 + \bar{P}_1A_p + B_2\bar{P}_2 + \bar{P}_2B_2^T + B_1B_1^T & (C_1\bar{P}_1 + D_{12}\bar{P}_2)^T \\ C_1\bar{P}_1 + D_{12}\bar{P}_2 & -\gamma^{-2}I \end{bmatrix} < 0 \tag{18}$$

where $\gamma = \sqrt{\rho}$. Finally, controller K can be solved by the YALMIP tools in an open-source environment. The stability of the proposed controller can be ensured through optimization using quadratic programming and the H -infinite performance indicator in parameter turning.

4. Simulations and Analysis

The accelerated saturation usually occurs during extreme external disturbance and is caused by the power constraints in the MISP. When the actuator reaches or exceeds its limit value, it loses its acceleration regulation capability. Therefore, the immediate activation method for the anti-windup LADRC proves inefficient, despite being widely used in low-cost systems as a multiple activated method for the anti-windup compensator. To address this issue, an anticipatory activation method was investigated and tested. Initially, the system was simulated under normal conditions without accelerated saturation, serving

as a comparison group. Subsequently, the anti-windup controller with the immediate activation method was implemented. Following this, the controller employing an anticipatory activation method was tested under the same external disturbance. Finally, the simulation results were contrasted and analyzed.

4.1. Parameter Setting of the System

To enhance effectiveness, the simulation utilizes attitude data recorded from USV sailing, which is considered as the external disturbance from the base. The definitions of the pitch and roll angles of the USV are depicted in Figure 4.

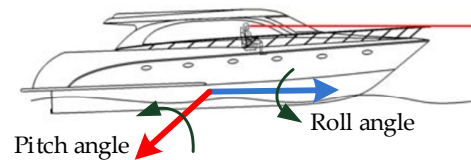


Figure 4. The axes of attitude angles of the USV.

The data describe two instances of the USV’s instantaneous acceleration during sailing. The trajectory of the angle and angular rate in the pitch axis are depicted in Figure 5. The angular acceleration in the pitch axis during sailing is calculated from the angular rate as shown in Figure 6.

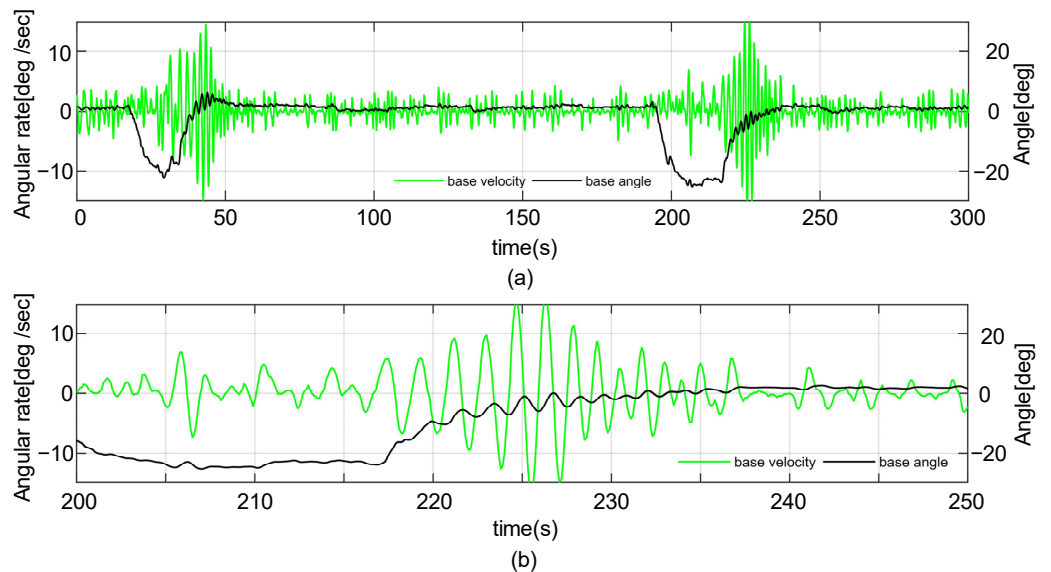


Figure 5. Recorded attitude data of the UAV for pitch angle and angular rate: (a) complete data of angle and angular rate; (b) data for 50 s.

From the recorded data, it can be seen that there are overshoots in the angular rate and acceleration during sailing with instantaneous acceleration. To establish a quantitative relationship between the disturbance and the actuator’s accelerated saturation, the disturbance is quantified by the degree of the accelerated overshoot as defined in Equation (19). According to the USV’s attitude data and for ease of analysis during the simulation, the external disturbance is set as a sinusoidal signal, representing the base velocity combined with only one overshoot in the angular rate. The parameters are specified in Table 1.

$$\alpha = \begin{cases} \frac{a_b - a_{max}}{a_{max}} \times 100\% & a_b > a_{max} \\ 0 & a_b \leq a_{max} \end{cases} \quad (19)$$

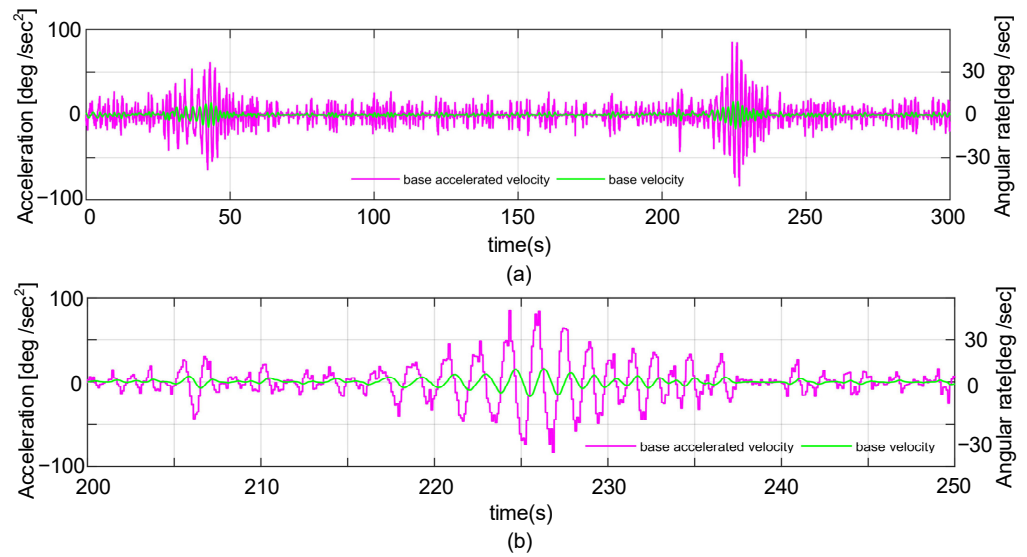


Figure 6. Trajectory of angular acceleration obtained from the angular rate: (a) complete data of acceleration; (b) data for 50 s.

Table 1. The parameters of the external disturbance from the base.

External Disturbance	Maximal Velocity	Maximal Acceleration	Duration
base velocity	5°/s	35°/s ²	8 s
Overshoot	10°/s	70°/s ²	1 s

Therefore, a_b represents the absolute value of angular acceleration from the base, where $a_b = 35^\circ/s^2$ during the base velocity phase. Consequently, the maximal acceleration values of the actuator are $a_{max} = 70^\circ/s^2$ and $a_b = a_{max}$ during the overshoot. This establishes the threshold, where $\alpha = 0$ when the system operates under normal conditions. Subsequently, $\alpha > 0$ indicates that the actuator’s accelerated saturation has occurred, and the severity increases with the growth of its value.

The observation bandwidth of the LESO with anti-windup compensation is designed at 0.5 kHz, and the operation update rate is 1 kHz. Consequently, the LESO bandwidth is set as $\omega_e = 0.5$. Referring to Equation (12), the gains of the LESO can be adjusted in Table 2.

Table 2. The gains of the LESO with an operational bandwidth of 1 kHz.

LESO Bandwidth	Gains for LESO
$\omega_e = 0.5$	$l_1 = 1.5, l_2 = 0.75, l_3 = 0.125$

The gains of controller K , which can be determined using the matrixes presented in Section 3.3, represent the matrixes inequalities presented in Equations (17) and (18). These can be solved using the YALMIP tools.

The actuator coefficient is $k_m = 0.00432$. Combining the bandwidth of the actuator operation, set at 0.1 kHz, we determined the gain $b_0 = 0.432$ for the system model. Based on the optimized results obtained using the YALMIP tools, as shown in Table 3, the gains can be determined as $\gamma = 0.8$.

To simplify the process of acquiring the observed total disturbance, the gain of the anti-windup compensator was set as $j_a = l_3 j_q$. The observed total disturbance was equal to $\dot{z}_3 = l_3(\varepsilon - j_q q)$, which means that the saturation feedback, q , can be regarded as an adjustment value to the observed error, ε , in the state x_3 .

Table 3. The gains of the controller, K , with different values of γ .

Gains for K	Conditions
$k_1 = 2.1786, k_2 = 4.5847, -1/b_0 = -2.3115$	$\gamma = 1.0$
$k_1 = 2.1788, k_2 = 4.5852, -1/b_0 = -2.3062$	$\gamma = 0.9$
$k_1 = 2.1790, k_2 = 4.5855, -1/b_0 = -2.3038$	$\gamma = 0.8$
$k_1 = 2.1859, k_2 = 4.6226, -1/b_0 = -1.3038$	$\gamma = 0.7$
$k_1 = 2.1864, k_2 = 4.6237, -1/b_0 = -1.3631$	$\gamma = 0.6$
$k_1 = 2.1870, k_2 = 4.6249, -1/b_0 = -1.2995$	$\gamma = 0.5$

4.2. Simulations in the Normal Condition

The system operated within the limitation of the acceleration during an overshoot. The output angular rate of the actuator compensates for disturbances from the base, as shown in Figure 7.

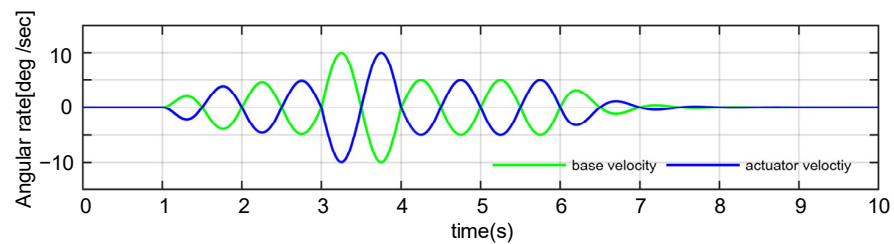


Figure 7. Angular rate of the actuator while compensating for the disturbance from the base.

In Figure 8a, the control signal of the actuator, u , is a combination of the tracking output, u_0 , and observed disturbance variable, z_3 . The equation $u - sat(u)$ served as feedback for accelerated saturation and remained at 0 throughout the test. However, vibrations in the control signal, u , were observed at the beginning when the overshoots were introduced. Nonetheless, the LOS vibrations are no more than $1^\circ/s$ during the overshoots, as illustrated in Figure 8b.

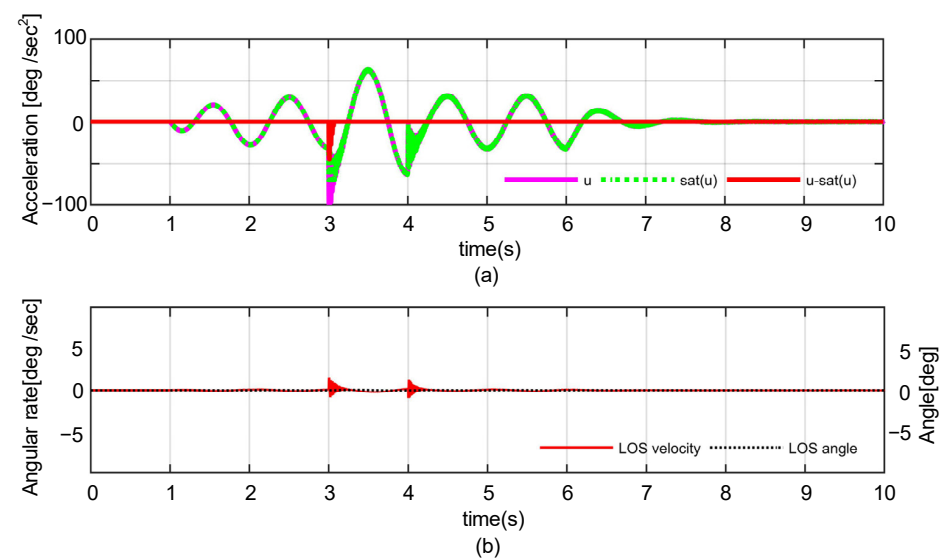


Figure 8. The system is simulated within the constraints of acceleration: (a) the accelerated control signal of the actuator; (b) the LOS angle and angular rate during the disturbance without saturation.

4.3. Simulations under Acceleration-Limited Conditions

4.3.1. Immediate Activation Method

According to the recorded data, overshoots are alternately set at $\alpha = 5\%$ and $\alpha = 10\%$, while the system operates under accelerated saturations. Consequently, the maximum

accelerations of the overshoots are around $73.5^\circ/s^2$ and $77.0^\circ/s^2$, respectively. The LADRC with an anti-windup compensator is configured with an immediate activation model. As shown in Figure 9a, when the overshoot degree is set to $\alpha = 5\%$, the controller output, u , shows vibrations following the introduction of the overshoots, retaining high-frequency vibrations with an amplitude of less than $10^\circ/s^2$ as the overshoots diminish. Additionally, when $\alpha = 10\%$ in Figure 9b, the amplitude of the vibrations reaches almost $50^\circ/s^2$ as the overshoots diminish. The maximum acceleration value corresponding to the accelerated saturation feedback, q , during this process is $100^\circ/s^2$, and the data range in all figures is referenced within this value.

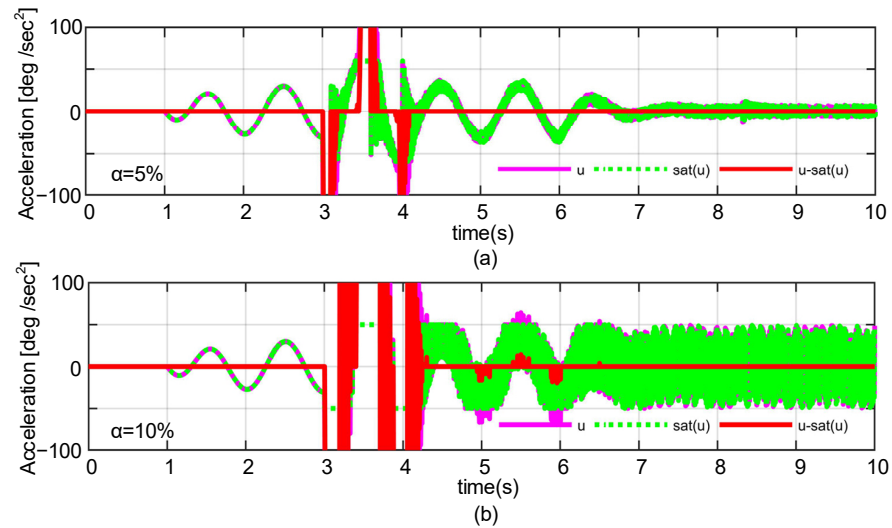


Figure 9. The control signal and saturation quality with the immediate activation method: (a) the accelerated overshoot is 5%; (b) the accelerated overshoot is 10%.

As illustrated in Figure 10a, there are attenuated high-frequency vibrations in the angular rate of the LOS during the overshoots, reaching a maximum amplitude of approximately $5^\circ/s$ when $\alpha = 5\%$. Additionally, at $\alpha = 10\%$, the maximum amplitude reduces to approximately $10^\circ/s$, with low-frequency vibrations exceeding $13^\circ/s$ in Figure 10b. The angle of the LOS is almost 3° during the overshoots. High-frequency vibrations still exist in the angular rate with a low amplitude when the overshoots diminish.

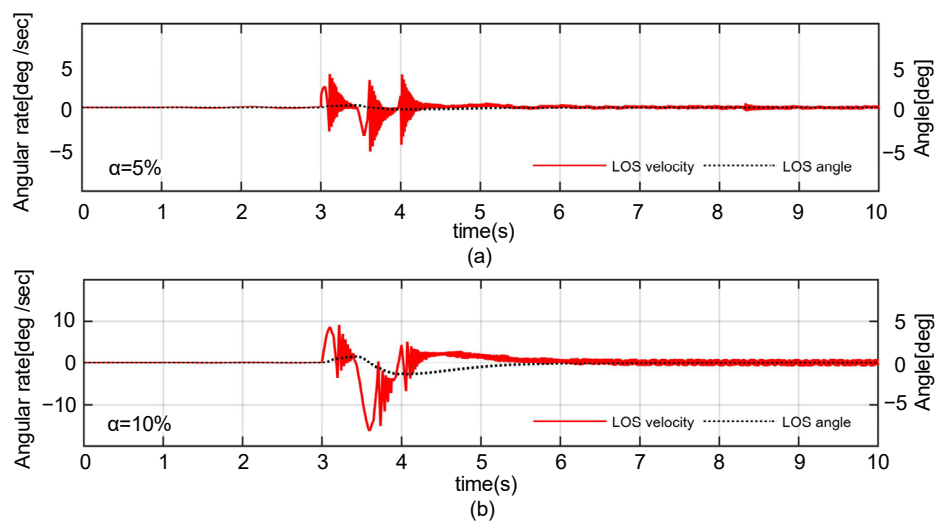


Figure 10. High-frequency vibrations of the LOS in angle and angular rate with the immediate activation method: (a) the accelerated overshoot is 5%; (b) the accelerated overshoot is 10%.

4.3.2. Anticipatory Activation Method

To facilitate the implementation of anticipatory activation for the compensator, the threshold value, u_s , is proposed and defined as:

$$\lambda |u_a| \leq |u_s| < |u_a|, 0 < \lambda < 1 \tag{20}$$

Hence, the anti-windup compensator operates in three states: normal mode (Model 1), anticipatory activation mode (Model 2), and acceleration-limited mode (Model 3).

Model 1: $|u| \leq |u_s|$ and $q = 0$. In this mode, no saturation occurs with the actuator and the tracking system operates as a normal system.

Model 2: $|u_s| < |u| \leq |u_a|$ and $q > 0$. In this model, accelerated saturation occurs. The disturbance observation term z_3 introduced by the LESO incorporates a saturation feedback term, q , and pre-compensation control is conducted through the stabilized control loop.

Model 3: $|u| > |u_a|$. The system enters a substantial saturation state, where the control input, u , corresponding to the acceleration exceeds the output limit of the actuator. The actuator's acceleration output remains at its limited value.

The proposed controller, operating on the LADRC with an anti-windup compensator using an anticipatory activation method, is simulated under the same conditions as the overshoot scenario. The threshold values are set as $\lambda = 0.85$ and $\lambda \cdot a_{max} = 59.5^\circ/s$. Compared to the immediate activation method, accelerated saturation rarely occurs during the overshoots. These two conditions are demonstrated in Figure 11; when $\alpha = 5\%$ and $\alpha = 10\%$, the control signal, u , exhibits a smaller amplitude in vibrations after the overshoots.

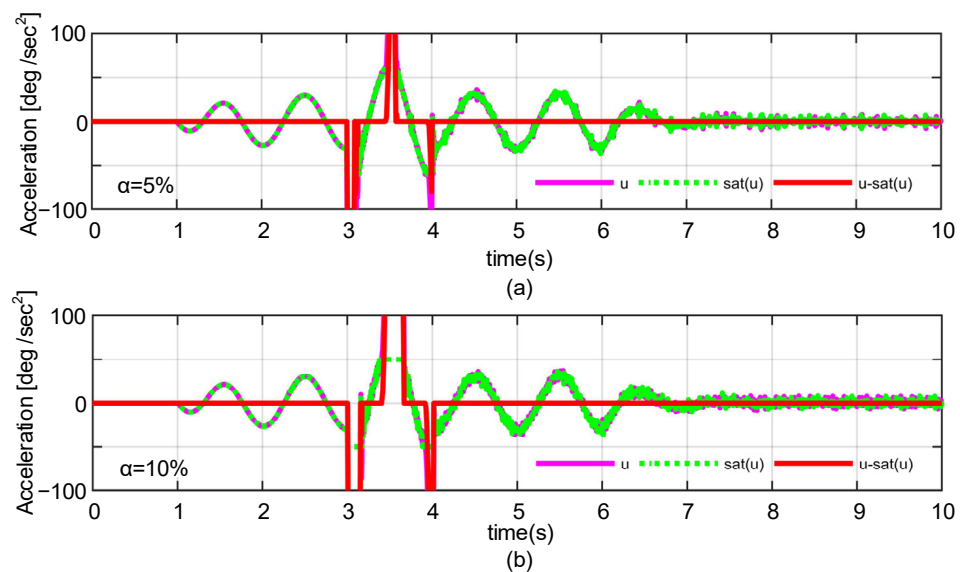


Figure 11. The control signal and saturation quality with the anticipatory activation method: (a) the accelerated overshoot is 5%; (b) the accelerated overshoot is 10%.

According to Figure 12, the high-frequency vibrations in the angular rate of the LOS are weakened in the case of $\alpha = 5\%$, which can lead to an interference in the visual identification. Conversely, for $\alpha = 10\%$, these vibrations are almost eliminated, and the amplitude of low-frequency vibrations remain within $18^\circ/s$. Furthermore, there are almost no vibrations in the angular rate.

4.3.3. Simulations with Recorded Attitude Data

Comparing the simulations based on an individual overshoot in acceleration, it can be seen that the disturbance is introduced by the recorded data from the USV sailing, with results sampled from 200 to 250 s. During the simulation, the value of α ranged from 5% to

10%. According to the results illustrated in Figure 13, when compared to the immediate activation method, the proposed controller exhibits greater stability with the regulation of the accelerated signal, $sat(u)$, and less accelerated saturation, as indicated by $u - sat(u)$.

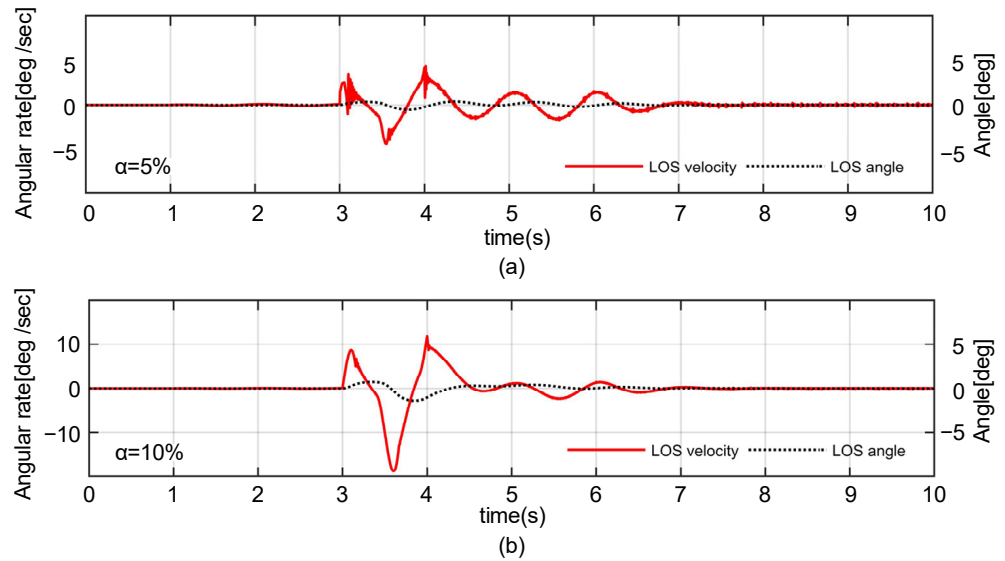


Figure 12. Vibrations of the LOS in angle and angular rate with anticipatory activation method: (a) the accelerated overshoot is 5%; (b) the accelerated overshoot is 10%.

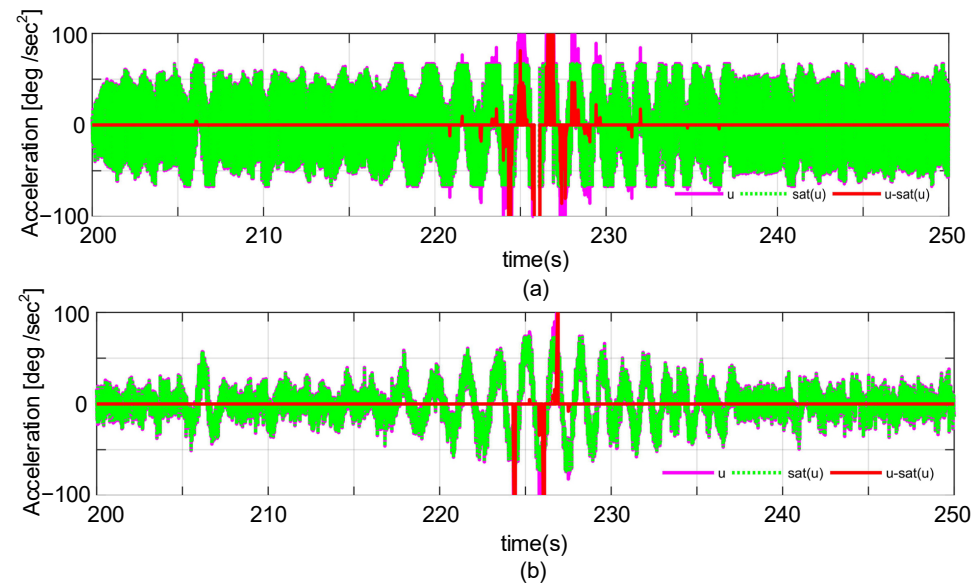


Figure 13. Comparison of control signal and saturation quality between different activations: (a) immediate activation; (b) anticipatory activation.

The instability of the regulation during the process results in vibrations on the LOS, as illustrated in Figure 14. Low-frequency vibrations on the LOS imply a better quality of identification by the visual sensor mounted on the MISP. The proposed controller avoids high-frequency vibrations during overshoots when compared to the immediate activation method.

The simulation with the recorded data supports the result that the anti-windup controller in the anticipatory activation mode effectively suppresses the high-frequency vibrations in the angular rate of the LOS, which occur due to the accelerated saturation of the actuator in the control process.

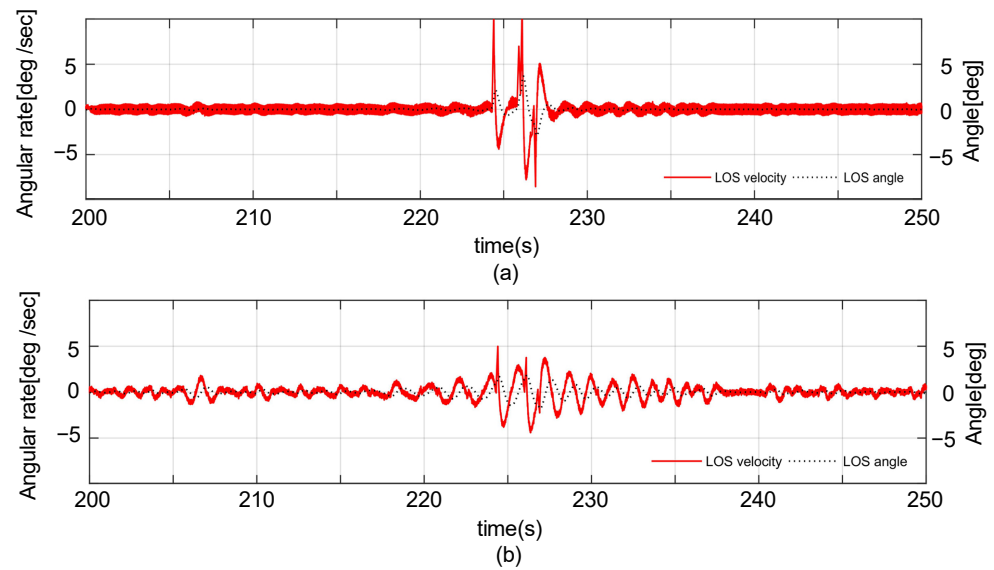


Figure 14. Comparison of angle and angular rate on the LOS during accelerated saturation: (a) immediate activation; (b) anticipatory activation.

5. Experimental Verifications

5.1. Hardware of the Dynamic Camera Platform

In the visual tracking control for the MISP, the occurrence of high-frequency vibrations in the angular rate of the LOS can lead to several adverse effects, including blurred vision, introduction of disturbances, failure of target identification, and exacerbation of stability issues within the control system. This section aims to assess the performance of the LADRC with an anti-windup compensator on a dynamic camera platform, as illustrated in Figure 15. The controller was evaluated using both anticipatory activation and immediate activation methods, and the obtained results were subjected to comparative analysis.

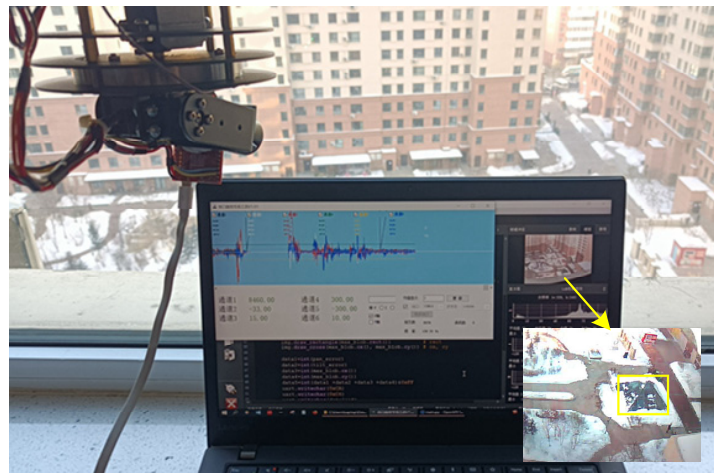


Figure 15. Dynamic camera platform with test and data acquisition systems.

The experiment focused on target tracking in USV-UAV joint operations in a marine environment. The target may be the sea marker or USV for visual navigation. The scenario is simulated with the ground target, and the FOV captured by the visual sensor is depicted in Figure 16. Performance parameters for controlling the platform are outlined in Table 4. The dynamic camera platform was installed on motion equipment capable of simulating the motions experienced during UAV hover or flight modes. This setup provides external disturbances on the base velocity. To approximate the scenario of the recorded date, the base

motion was simulated using a sinusoidal velocity curve with a period of 1.2 s, incorporating a 7% random disturbance.



Figure 16. The geographical target in the yellow square for tracking in the FOV.

Table 4. Parameters of the dynamic camera platform.

	Terms	Scope Range	Accuracy
Pitch	Angular rate	$\pm 190^\circ / s$	Gyro: $0 \sim \pm 250^\circ / s$, 131 LSB/ $(^\circ / s)$
	Angular acceleration	$\pm 70^\circ / s^2$	
Yaw	Pitch angle speed	$\pm 170^\circ / s$	Gyro: $0 \sim \pm 250^\circ / s$, 131 LSB/ $(^\circ / s)$
	Yaw angle speed	$\pm 70^\circ / s^2$	
Visual resolution		320×240	1 pixel

During the initialization of the experiment, the target was identified by a visual sensor and captured at the center of the FOV. There was no base motion acting as the external disturbance until the LOS stabilized. During the experiment, the maximum angular rate reached approximately $\pm 10^\circ / s$ and the maximum acceleration reached $\pm 75^\circ / s^2$, equivalent to $\alpha = 6.7\%$. The subsequent experiment results and analysis are detailed below.

5.2. Comparison and Analyses

The platform operates under an immediate activation model, compensating for the base velocity, as illustrated in Figure 17a. However, the velocity control loop becomes unstable when the disturbance’s acceleration surpasses the actuator’s threshold value, leading to high-frequency vibrations in the output velocity. Due to physical constraints within the real system, these vibrations converge faster than in simulations. Consequently, the LOS velocity is affected, as depicted in Figure 17b. The velocity vibrations in the LOS significantly reduce the identification performance, as evident in Figure 18. Each screenshot per second from the visual sensor reveals swaying in the FOV. The misidentification of the target renders the visual tracking loop nonfunctional.

For enhancement, the platform incorporates a controller with an anticipatory activation method, showcasing the control performance in Figure 19. Noticeably, the high-frequency vibrations in the velocity-stabilized loop have been significantly suppressed. The actuator’s output effectively compensates for the base velocity to a maximum extent. Consequently, there is a substantial improvement in the stability of the LOS, resulting in sufficient target identification, as illustrated in Figure 20. This reinforces the robustness and stability of the system through the visual tracking loop.

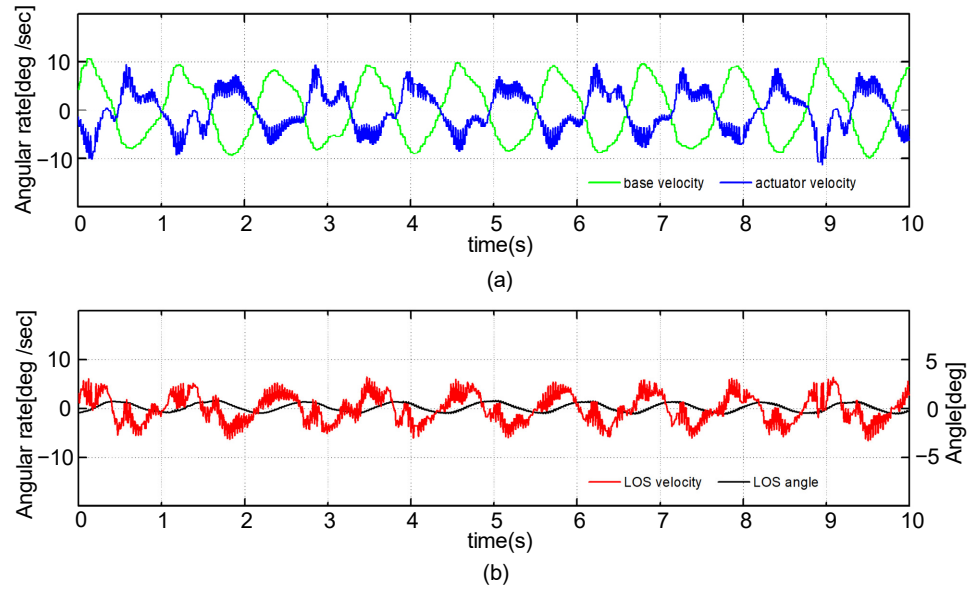


Figure 17. The system operating under 5~7% accelerated overshoots from the base with the immediate activation method: (a) the angular rate of the actuator during compensation for the base disturbance; (b) vibrations of the LOS in angle and angular rate.



Figure 18. The geographical target remains unidentified due to the vibrations of the LOS.

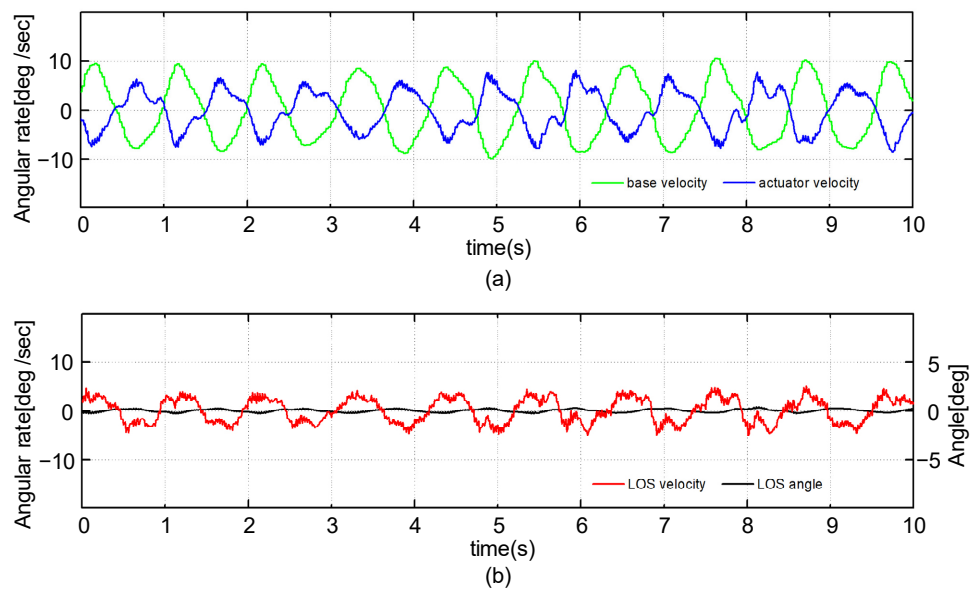


Figure 19. The system operates at 5~7% accelerated overshoots from the base with the anticipatory activation method: (a) the angular rate of the actuator during compensation for the base disturbance; (b) vibrations of the LOS in angle and angular rate.

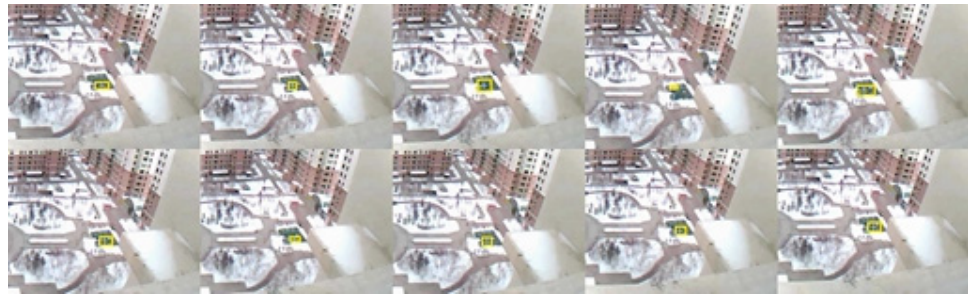


Figure 20. The geography target is identified and tracked by the stabilized LOS during the overshoot from the base.

6. Conclusions

In this paper, an anticipatory anti-windup method based on the LADRC has a significant effect on suppressing the high-frequency vibrations on the LOS caused by accelerated actuator saturation. The experimental results of visual tracking for the MISP demonstrate that the target can be identified during low-frequency vibrations with the proposed controller. The robustness of the stabilized control system is ensured through optimization using quadratic programming and an H-infinite performance indicator. As part of the investigation into the multiple activated anti-windup method, the limitations of immediate activation in addressing accelerated saturation have been analyzed through comparisons in the simulations and experiments. The simulations incorporate recorded attitude data from USV sailing as the external disturbance, representing just one scenario of USV sailing. In future work, additional attitude data from various USV sailing cases or UAV cruises will be provided to enhance the credibility of the simulation results. Actual experiments will be conducted in the marine environment for USVs to further validate the proposed method. Additionally, other methods will be explored to address accelerated saturation and optimize the control system.

Author Contributions: T.F. and Y.G. conceived the idea; T.F. designed the software, collected the data, and analyzed the experimental data; L.G. collected the related resources and supervised the experiment; T.F. prepared the original draft and final article; C.Q. proposed the comments for the paper and experiment. All authors have read and agreed to the published version of the manuscript.

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