Sliding Mode Regulator as Solution to Optimal Control Problem

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Abstract—This paper presents the optimal control problem for a linear system with respect to a Bolza-Meyer criterion with a non-quadratic non-integral term. The optimal solution is obtained as a sliding mode control, whereas the conventional linear feedback control fails to provide a causal solution. Performance of the obtained optimal controller is verified in the illustrative example against the conventional LQ regulator that is optimal for the quadratic Bolza-Meyer criterion. The simulation results confirm an advantage in favor of the designed sliding mode control.

I. INTRODUCTION

Since the sliding mode control was invented in the beginning of 1970s (see a historical review in [1]), the sliding mode control technique is currently used in stabilization [2], [3], tracking [4], observer design [5], identification [6], frequency domain analysis [7], and other control problems. Other promising modifications of the original sliding mode concept, such as integral sliding mode [8], are developed. Application of the sliding mode method is extended even to stochastic systems [9], [10] and stochastic filtering problems [11], [12]. However, although it is possible to design a sliding manifold so that an infinite-horizon quadratic cost functional including the system state only is minimized [1], it seems, to the best of authors’ knowledge, that no optimal sliding mode algorithms, solving the optimal control problem for a Bolza-Meyer criterion with the quadratic control term [13], [14], have been designed. Meanwhile, simply the fact that the sliding mode control has a transparent physical sense [1] and is successfully applied to many technical problems [15] leads to a conjecture that the optimal control problems whose solution is given by a sliding mode control should exist. One of those optimal control problems is considered in this paper.

This paper presents the solution to the optimal control problem for a linear system with a Bolza-Meyer criterion, where the integral control and state energy terms are quadratic and the non-integral term is of the first degree. That type of criteria would be useful in the joint control and parameter identification problems where the objective should be reached for a finite time. It is shown that optimal solution is given by a causal sliding mode control, whereas the conventional linear feedback control does not lead to a causal solution and, therefore, fails. The theoretical result is complemented with an illustrative example verifying performance of the designed control algorithm. The optimal sliding mode regulator is compared to the conventional LQR corresponding to the quadratic Bolza-Meyer criterion. The simulation results confirm an advantage in favor of the designed sliding mode control. For comparison purposes, both sliding mode and LQ regulators are applied to minimizing the quadratic Bolza-Meyer criterion without the non-integral term. In accordance with the developed theory, the simulation results confirm coincidence of both, sliding mode and linear feedback, optimal control algorithms in this case.

The paper is organized as follows. Section 2 states the optimal control problem for a linear system with a non-quadratic Bolza-Meyer criterion. The sliding mode solution to the optimal control problem is given in Section 3. The proof of the obtained results is given in Appendix. Section 4 contains an illustrative example.

II. OPTIMAL CONTROL PROBLEM STATEMENT

Consider a conventional linear time-varying system

\[ \dot{x}(t) = A(t)x(t) + B(t)u(t), \quad x(t_0) = x_0, \]

where \( x(t) \in \mathbb{R}^n \) is the system state and \( u(t) \in \mathbb{R}^m \) is the control input. The coefficients \( A(t) \) and \( B(t) \) are considered continuous functions of time. Without loss of generality, the system (1) (pair \( (A, B) \)) is assumed to be controllable, i.e., the uncontrollable state components are removed from the consideration.

In the classical linear optimal control problem [13], [14], the criterion to be minimized is defined as a quadratic Bolza-Meyer functional:

\[ J_2 = \frac{1}{2} [x(T)]^T \Psi [x(T)] + \frac{1}{2} \int_{t_0}^{T} (u^T(s)R(s)u(s) + x^T(s)L(s)x(s))ds, \]

where \( R(t) \) is positive and \( \Psi, L(t) \) are nonnegative definite symmetric matrix functions, and \( T > t_0 \) is a certain time moment. The solution to this problem is well-known [13], [14] and considered fundamental for the optimal linear systems theory.

In this paper, the criterion to be minimized includes a non-quadratic terminal term and is defined as follows:

\[ J_1 = \sum_{i,j=1}^{n} \psi_{ij} |x_j(T)| + \frac{1}{2} \int_{t_0}^{T} (u^T(s)R(s)u(s) + x^T(s)L(s)x(s))ds, \]
where $R(s)$ is positive and $L(s)$, $\psi$ are nonnegative definite continuous symmetric matrix functions, and $|x| = [|x_1|, \ldots, |x_n|] \in \mathbb{R}^n$ is defined as the vector of absolute values of the components of the vector $x \in \mathbb{R}^n$.

The optimal control problem is to find the control $u^*(t)$, $t \in [t_0, T]$, that minimizes the criterion $J_1$ (3) along with the trajectory $x^*(t)$, $t \in [t_0, T]$, generated upon substituting $u^*(t)$ into the state equation (1).

A solution to the stated optimal control problem is given in the next section and then proved in Appendix. As demonstrated, the obtained solution is a sliding mode control that is optimal with respect to the criterion (3).

III. OPTIMAL CONTROL PROBLEM SOLUTION

The solution to the optimal control problem for the linear system (1) and the criterion (3) is given as follows. The optimal control law takes the sliding mode control form

$$u^*(t) = R^{-1}(t)B^T(t)Q(t)\text{Sign}[x(t)],$$

(4)

where the Signum function of a vector $x = [x_1, \ldots, x_n] \in \mathbb{R}^n$ is defined as $\text{Sign}[x] = [\text{sign}(x_1), \ldots, \text{sign}(x_n)] \in \mathbb{R}^n$, the signum function of a scalar $x$ is defined as $\text{sign}(x) = 1$, if $x > 0$, $\text{sign}(x) = 0$, if $x = 0$, and $\text{sign}(x) = -1$, if $x < 0$.

The control problem is to find the control $u(t)$, $t \in [0, T]$, if the terminal condition for the equation (5) is optimal with respect to the criterion (3).

Remark 1. It is not difficult to see that the solution $Q_0(t)$ really exists and can be calculated. Indeed, if $\psi = 0$ in the criteria (2) and (3) and the non-integral term is absent, then the optimal solutions with respect to both criteria coincide (see Appendix for the proof). In this case, as follows from the optimal LQR theory [13, 14], the optimal gain matrix $Q(t)$ has zero terminal value, $Q(T) = 0$, however, the state terminal value is different from zero, $x(T) \neq 0$. Then, decreasing the value of $-\psi$ as the terminal condition for the equation (5) and, consequently, increasing the energy of the control (4), the zero terminal state value would be reached for a certain negative definite value of $-\psi_0$, taking into account that each manifold $x_i = 0$, $i = 1, \ldots, n$, is sliding for the corresponding component $x_i$ and the system (1) is assumed controllable. Finally, the solution of the equation (5) with the terminal condition $-\psi_0$ would be the desired solution $Q_0(t)$.

Remark 2. Note that Theorem 1 suggests a feasible algorithm for numerical solution of the gain matrix equation (5). Indeed, first, the system of equations (1),(4),(5) is solved with a given initial condition $x_0$ and the terminal condition $-\psi$ corresponding to the non-integral term in the criterion (3). Any known numerical method, such as “shooting,” which consists in varying initial conditions for (5) until a given terminal condition is satisfied, could be used. If the system state $x(t)$ does not reach zero in the interval $[0, T]$ or reaches exactly at the final moment $t = T$, then the optimal trajectory and the optimal control are found. If $x(t)$ reaches zero at any point $t < T$, the system of equations (1),(4),(5) is solved again with the initial condition $x_0$ and the terminal condition $-\psi_0$, yielding the solution $Q_0(t)$. The corresponding solution of the equation (1) yields the optimal trajectory. The formula (4) with substituted $Q_0(t)$ and the optimal trajectory yields the optimal control as a function of time.

Remark 3. As follows from Theorem 1, application of the sliding mode control (4) leads to a causal terminal condition for the gain matrix equation (5), which makes the optimal control problem numerically solvable. In contrast, application of the linear feedback control $u^*(t) = K(t)x(t)$ leads to the terminal condition $Q(T) = -\psi \ast \text{Sign}[x(T)]$, which explicitly depends on the unknown value $x(T)$, and, therefore, is non-causal. As well-known, non-causal problems are not numerically solvable and unusable in practice. Thus, in case of a criterion (3), the sliding mode control allows one to obtain a feasible solution to the optimal control problem, whereas the classical linear feedback control fails.

IV. EXAMPLE

This section presents an illustrative example of designing the optimal regulator for a system (1) with a criterion (3), using the scheme (4)–(6).

Consider a scalar linear system

$$\dot{x}(t) = x(t) + u(t), \quad x(0) = 1.$$  

(7)

The control problem is to find the control $u(t)$, $t \in [0, T]$,
$T = 5$, that minimizes the criterion
\[ J_1 = 50 \mid x(T) \mid + \frac{1}{2} \int_0^T u^2(t)dt + \int_0^T x^2(t)dt, \quad (8) \]
where $|x|$ denotes the absolute value of a scalar variable $x$.

Applying the optimal regulator (4)-(6), the control law (4) is given by
\[ u^*(t) = Q^*(t)\text{sign}[x(t)], \quad (9) \]
where $Q^*(t)$ satisfies the equation
\[ \dot{Q}^*(t) = \mid x(t) \mid - Q^*(t), \quad (10) \]
with the initial condition $Q^*(5) = -50$, if $x(t) \neq 0$ for any $t < 5$, and $Q^*(5) = 0$, otherwise.

Upon substituting the control (9) and the obtained expression for $Q^*(t)$ into (7), the optimally controlled system takes the form
\[ \dot{x}(t) = x(t) + Q^*(t)\text{sign}[x(t)], \quad x(0) = 0. \quad (11) \]
The obtained system (10),(11) can be solved using simple numerical methods, such as "shooting." This method consists in varying initial conditions of (10) until the given terminal condition is satisfied.

The system (10),(11) is first simulated with the terminal condition $Q^*(5) = -50$. As the simulation shows, the state $x(t)$ reaches zero before the final moment $T = 5$. Accordingly, the terminal condition for the equation (10) is reset to $Q^*(5) = -\psi_0$ such that $x(5) = 0$ (see Remark 2 in Section 3), and the system (10),(11) is simulated again. The results obtained applying the regulator (9)–(11) to the system (7) are shown in Fig. 1, which presents the graphs of the gain matrix (10) $Q^*(t)$, the control (9) $u^*(t)$, the state (7) $x(t)$, and the criterion (8) $J_1(t)$ in the interval $[0,5]$. The value of the criterion (8) at the final moment $T = 5$ is $J_1(5) = 2.4142 + 2.1 \times 10^{-3} = 2.4163$. To provide better comparison, Figure 3 presents the graphs of the control functions (9) $u^*(t)$ and (13) $u(t)$ and the corresponding state trajectories (7) $x(t)$ in detail in the interval $[4.995,5]$. It can be observed that the optimal sliding mode control (9) yields a certainly better value of the criterion (8) in comparison to the linear feedback control (13). Note again that the classical linear feedback control fails to provide a causal optimal control for the criterion (8) (see also Remark 3).

For verification purposes, both, the sliding mode and linear feedback control laws, are applied to minimizing the criterion
\[ J = \frac{1}{2} \left[ \int_0^T u^2(t)dt + \int_0^T x^2(t)dt \right], \quad (16) \]
which coincides with the criteria (8) and (12), if the nonlinear term is absent. In this case, the optimal sliding mode regulator
\[ u^*(t) = Q^*(t)\text{sign}[x(t)], \]

\[ Q^*(t) = \mid x(t) \mid - Q^*(t), \quad Q(5) = 0, \quad (17) \]

and the optimal linear feedback regulator
\[ u(t) = Q(t)x(t), \]

\[ \dot{Q}(t) = 1 - 2Q(t) - Q^2(t), \quad (18) \]
yield the same control $u^*(t) = u(t)$ and, accordingly, the same optimal trajectory $x(t)$ and the same final criterion value $J(5) = 2.4142$, although the gain matrices $Q^*(t)$ and $Q(t)$ are different. The graphs of the gain matrices $Q^*(t)$ and $Q(t)$ are shown in Fig. 4.

V. APPENDIX

Proof of Theorem 1. Necessity. Define the Hamiltonian function [13] for the optimal control problem (1),(3) as
\[ H(x,u,q,t) = \frac{1}{2}(u^TR(t)u + x^TL(t)x + q^T \dot{x}(t)) = \]

\[ \frac{1}{2}(u^TR(t)u + x^TL(t)x + q^T [A(t)x + B(t)u]). \quad (19) \]

Applying the maximum principle condition $\partial H / \partial u = 0$ to this specific Hamiltonian function (19) yields
\[ \partial H / \partial u = 0 \Rightarrow R(t)u(t) + B^T(t)q(t) = 0. \]
Accordingly, the optimal control law is obtained as
\[ u^*(t) = -R^{-1}(t)B^T(t)q(t). \]

Let us seek \( q(t) \) as the Signum function of \( x(t) \) multiplied by a gain matrix
\[ q(t) = -Q(t)\text{Sign}[x(t)], \quad (20) \]
where \( Q(t) \) is a square symmetric matrix of dimension \( n \times n \). This yields the complete form of the optimal control
\[ u^*(t) = R^{-1}(t)B^T(t)Q(t)\text{Sign}[x(t)]. \quad (21) \]

Using the co-state equation \( dq(t)/dt = -\partial H/\partial x \), which gives
\[ -dq(t)/dt = L(t)x(t) + A^T(t)q(t), \quad (22) \]
and substituting (20) into (22), we obtain
\[ \dot{Q}(t)\text{Sign}[x(t)] + Q(t)d\text{Sign}[x(t)]/dt = L(t)x(t) - A^T(t)Q(t)\text{Sign}[x(t)]. \quad (23) \]

Taking into account that \( d\text{Sign}[x(t)]/dx = 0 \) almost everywhere outside the sliding manifold \( x(t) = 0 \), the following equation is obtained
\[ \dot{Q}(t)\text{Sign}[x(t)] = L(t)x(t) - A^T(t)Q(t)\text{Sign}[x(t)]. \quad (24) \]

Note that if \( x(t) = 0 \), then \( u(t) = 0 \); therefore, the value of \( Q(t) \) is no longer needed. The equation (24) is satisfied, if \( Q(t) \) is assigned as a solution of the equation (5).

Note that if the state \( x(t) \) does not reach the sliding manifold \( x(t) = 0 \) at an interior point of the interval \([0,T]\), the transversality condition [13] for \( q(T) \) implies that
\[ q(T) = -Q(T)\text{Sign}[x(T)] = \partial J/\partial x(T) = \psi\text{Sign}[x(T)], \]
which is satisfied if
\[ Q(T) = -\psi. \quad (25) \]

However, if \( x(t) \) reaches the sliding manifold \( x(t) = 0 \) before the final moment \( t = T \), then the transversality condition is not useful, since the problem becomes a two fixed point problem where the terminal point is fixed at an \textit{a priori} unknown time moment when \( x(t) \) reaches the sliding manifold \( x(t) = 0 \). Given that the final state value \( x(T) \) remains equal to zero, if the state enters the sliding mode before the final moment \( t = T \), only the integral part of the criterion should be minimized over all control laws providing that \( x(t) \) reaches the sliding manifold \( x(t) = 0 \) within the interval \([0,T]\). Since the minimal value of the integral part of the criterion (3) over all possible controls is provided by the linear feedback control solving the optimal LQR problem (see also Remark 1 in Section 3), which leads to a nonzero final state value \( x(T) \) \( \neq 0 \) (see [13], [14]), the minimal value of the integral part of the criterion (3) over all control laws providing that \( x(t) \) reaches the sliding manifold \( x(t) = 0 \) within the interval \([0,T]\) is given by the control law, which brings the state into the sliding manifold \( x(t) = 0 \) exactly at the final moment \( t = T \). This control law corresponds to the gain matrix \( Q_0(t) \) in view of its definition in the paragraph after (5). Thus, the terminal conditions for the equation (5) are correctly defined by Theorem 1. The necessity part is proved.

**Sufficiency.** The optimality of the optimal control law \( u^*(t) \) given in Theorem 1 and by the formula (21) is proved in a standard way (see details, for example, in [16]): composing the Hamilton-Jacobi-Bellman (HJB) equation, corresponding to the Hamiltonian (19), and demonstrating that it is satisfied with the Bellman function \( V(x,t) = -\sum_{i,j=1}^{n} Q_{ij}(t) \vert x_j \vert \), where \( Q_{ij}(t) \) are the entries of the matrix \( Q(t) \) solving the equation (5). The demonstration mostly repeats the formulas (22)–(25) in the necessity part. Finally, minimizing the right-hand side of the HJB equation over \( u \) yields the optimal control \( u^*(t) \) in the form (21). The theorem is proved.

**Proof of Proposition in Remark 1.** Consider the optimal control problem for a linear system (1) with respect to the Bolza-Mayer criterion without a non-integral term

\[ J = \frac{1}{2} \int_0^T (u^T(s)R(s)u(s) + x^T(s)L(s)x(s))ds. \quad (26) \]

As follows from the optimal LQR theory [13], [14], the linear control law is given by
\[ u(t) = R^{-1}(t)B^T(t)Q(t)x(t), \quad (27) \]
where \( Q(t) \) satisfies the Riccati equation
\[ \dot{Q}(t) = -A^T(t)Q(t) - Q(t)A(t) + L(t) - Q(t)B(t)R^{-1}(t)B^T(t)Q(t), \quad (28) \]
with the terminal condition \( Q(T) = 0 \), and the optimally controlled system takes the form
\[ \dot{x}(t) = A(t)x(t) + B(t)R^{-1}(t)B^T(t)Q(t)x(t), \quad x(t_0) = x_0. \quad (29) \]

Let us show that the optimal LQ regulator (27)-(29) coincides with the optimal sliding mode regulator given by Theorem 1. Indeed, upon introducing the new gain matrix \( Q^*(t) = Q(t)^* \vert x(t) \vert \), the control law (27) turns to the sliding mode control (4) and the equation (29) coincides with (6). Furthermore, in view of (28) and (29), the newly introduced gain matrix \( Q^*(t) \) satisfies the equation
\[ \dot{Q^*}(t) = \frac{d(Q^*(t))}{dt} \left. |x(t)| \right. + \frac{dQ^*(t)}{dt} \left. |x(t)| \right. = \]
\[ \left. (-A^T(t)Q(t) - Q(t)A(t) + L(t) - Q(t)B(t)R^{-1}(t)B^T(t)Q(t))^* \right. |x(t)| \]
\[ \left. + Q(t)(A(t)^* \vert x(t) \vert + R^{-1}(t)B(t)^T(t)Q(t)^* \vert x(t) \vert ) \right. = \]
\[ L(t)^* \left. |x(t)| - A^T(t)Q(t)^* \right. \left. |x(t)| \right. = \]
\[ L(t)^* \left. |x(t)| - A^T(t)Q(t)^* \right. \left. |x(t)| \right. = \]
\[ L(t)^* \left. |x(t)| - A^T(t)Q(t)^* \right. \left. |x(t)| \right. = \]
with the terminal condition \( Q^*(T) = 0 \), which coincides with (5). The proposition is proved.
VI. CONCLUSIONS

This paper presents an optimal control problem, whose solution is given by a sliding mode control, thus addressing a challenging question known the beginning of the sliding mode control design: can a sliding mode control be a solution to an optimal control problem? The optimal control problem is considered for a linear system with a Bolza-Meyer criterion, where the integral control and state energy terms are quadratic and the non-integral term is of the first degree. That type of criteria would be useful in the joint control and parameter identification problems where the objective should be reached for a finite time. It is shown that optimal solution is given by a causal sliding mode control, whereas the conventional linear feedback control fails to provide a feasible solution. It is also verified that both sliding mode and LQ regulators yield the same optimal trajectory, being applied to the optimal control problem with respect to the quadratic Bolza-Meyer criterion without the non-integral term, whose solution is well-known from the LQR theory. The proposed approach based on a sliding mode control is expected to be applicable to other optimal control problems with non-quadratic criteria, where the conventional linear feedback control would not work.

REFERENCES


Fig. 2. Linear feedback regulator. Graphs of the gain matrix (14) $Q(t)$, the control (13) $u(t)$, the state (15) $x(t)$, and the criterion (8) $J_1(t)$ in the interval $[0, 5]$.

Fig. 3. Graphs of the graphs of the (15) $u^*(t)$ (thick) and (13) $u(t)$ (thin) and the corresponding state trajectories (7) $x(t)$ in detail in the interval $[4.995, 5]$.

Fig. 4. Graphs of the gain matrices $Q^*(t)$ (above) and $Q(t)$ (below) for criterion (16) $J_1$ without non-integral term.