Robust LQR Controller Design for Stabilizing and Trajectory Tracking of Inverted Pendulum

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Abstract

This paper describes the method for stabilizing and trajectory tracking of Self Erecting Single Inverted Pendulum (SESIP) using Linear Quadratic Regulator (LQR). A robust LQR is proposed in this paper not only to stabilize the pendulum in upright position but also to make the cart system to track the given reference signal even in the presence of disturbance. The control scheme of pendulum system consists of two controllers such as swing up controller and stabilizing controller. The main focus of this work is on the design of stabilizing controller which can accommodate the disturbance present in the system in the form of wind force. An optimal LQR controller with well tuned weighting matrices is implemented to stabilize the pendulum in the vertical position. The steady state and dynamic characteristics of the proposed controller are investigated by conducting experiments on benchmark linear inverted pendulum system. Experimental results prove that the proposed LQR controller can guarantee the inverted pendulum a faster and smoother stabilizing process with less oscillation and better robustness than a Full State Feedback (FSF) controller by pole placement approach.

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Selection and peer-review under responsibility of the organizing and review committee of IConDM 2013

Keywords: Inverted Pendulum, LQR Controller, PV Controller, Riccatti Equation, Full State Feedback Controller, Pole placement approach

1. Introduction

Inverted pendulum is an unstable, nonlinear, multivariable, fourth order, and under actuated system which can be treated as a typical control problem to study various modern control theories. The control of inverted pendulum
resembles the control systems that exist in some of the real time applications such as rockets and missiles, heavy crane lifting containers and self balancing robots. According to control purposes of inverted pendulum, the control of inverted pendulum can be divided into three aspects. The first aspect that is widely researched is the swing-up control of inverted pendulum [1, 2]. The second aspect is the stabilization of the inverted pendulum [3-4]. The third aspect is tracking control of the inverted pendulum [5]. In practice, stabilization and tracking control is more useful for plenty of real time applications. There are several problems to be solved in the control of inverted pendulum, such as swinging up and catching the pendulum from its stable pending position to the upright unstable position, and then balancing the pendulum at the upright position during disturbances, and further move the cart to a specified position on the rail [6]. Several methods for achieving swing-up and stabilization of pendulum system have been proposed in literature. In [7], a conservative law is derived from Lyapunov functions having a certain zone of non-convergence. A basic method of swing up control using energy methods for a cart-less pendulum has been proposed in [8]. This method has an advantage of a hierarchical nature, first controlling the pendulum angle, then the hinge position. However, in practical setups, there is an inherent limitation on the cart length and the magnitude of control force that can be applied. This gives the motivation to find out energy based methods for controlling and stabilizing the cart position with restricted cart length and restricted control force. The goal of this contribution is to implement the target tracking and stabilizing controller in real time for the linear inverted pendulum based on the control concepts of LQR theory and to report the disturbance rejection property of the LQR controller.

### Nomenclature

<table>
<thead>
<tr>
<th>Symbol</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>$\alpha$</td>
<td>pendulum angle</td>
</tr>
<tr>
<td>$x_c$</td>
<td>cart position</td>
</tr>
<tr>
<td>$\dot{x}_c$</td>
<td>cart velocity</td>
</tr>
<tr>
<td>$\zeta$</td>
<td>damping ratio</td>
</tr>
<tr>
<td>$\omega_n$</td>
<td>natural frequency of oscillation</td>
</tr>
<tr>
<td>$M_p$</td>
<td>pendulum mass</td>
</tr>
<tr>
<td>$M$</td>
<td>cart mass</td>
</tr>
<tr>
<td>$K_p$</td>
<td>proportional gain</td>
</tr>
<tr>
<td>$I$</td>
<td>pendulum moment of inertia</td>
</tr>
<tr>
<td>$K_v$</td>
<td>velocity gain</td>
</tr>
<tr>
<td>$K$</td>
<td>state feedback gain</td>
</tr>
<tr>
<td>$J$</td>
<td>cost function</td>
</tr>
<tr>
<td>$A$</td>
<td>system matrix</td>
</tr>
<tr>
<td>$B$</td>
<td>input matrix</td>
</tr>
<tr>
<td>$I_c$</td>
<td>length of the pendulum</td>
</tr>
<tr>
<td>$F_c$</td>
<td>cart input force</td>
</tr>
<tr>
<td>$V$</td>
<td>motor input voltage</td>
</tr>
<tr>
<td>$Q$, $R$</td>
<td>LQR weighting matrices</td>
</tr>
<tr>
<td>$K_m$</td>
<td>motor EMF constant</td>
</tr>
</tbody>
</table>

#### 2. System Model

The linear Self Erecting Single Inverted Pendulum (SESIP) consists of a pendulum system which is attached to a cart equipped with a motor that drives it along a horizontal track. The schematic diagram of inverted pendulum system is shown in Fig. 1. The motor attached to the cart is used to adjust the position and velocity of the cart and the track restricts the cart movement in the horizontal direction. Encoders are attached to the cart and the pivot in order to measure the cart position and pendulum joint angle, respectively.

![Fig. 1. Schematic of Cart-Inverted Pendulum](image)
2.1 Single Inverted Pendulum Equation of Motion

The schematic diagram and angle definitions of SESIP are shown in Fig. 2. The single inverted pendulum (SIP) system is made of a motor cart on top of which pendulum is pivoted. The movement of the cart is constrained only in the horizontal x direction, whereas the pendulum can rotate in the x-y plane [9]. The SIP system has two DOF and can be fully represented using two generalized coordinates such as horizontal displacement of the cart, \( x_c \) and rotational displacement of pendulum, \( \alpha \). The nominal plant model is obtained with the assumption that the coloumb’s friction applied to the linear cart and the force on the linear cart due to the pendulum’s action are negligible.

Applying Euler-Lagrangian energy equation to SESIP schematic shown in Fig. 2 results in

\[
\frac{d}{dt} \left[ \frac{\partial L}{\partial \dot{x}_c} \right] - \frac{\partial L}{\partial x_c} = Q_{x_c} \tag{1}
\]

and

\[
\frac{d}{dt} \left[ \frac{\partial L}{\partial \dot{\alpha}} \right] - \frac{\partial L}{\partial \alpha} = Q_{\alpha} \tag{2}
\]

With \( L = T - V \) where \( T \) is total kinetic energy, \( V \) is total potential energy, \( Q_{x_c} \) and \( Q_{\alpha} \) are the generalized force applied on the coordinate \( x_c \) and \( \alpha \), respectively. Both the generalized forces can be defined as follows:

\[
Q_{x_c}(t) = F_c(t) - B_{eq} \ddot{x}_c \tag{3}
\]

and

\[
Q_{\alpha} = -B_{p} \dot{\alpha}(t) \tag{4}
\]

This energy is usually caused by its vertical movement from normality (gravitational potential energy) or by a spring related sort of displacement. The cart linear motion is horizontal and as such, never has vertical displacement. So the total potential energy is fully represented by the pendulum’s gravitational potential energy, as characterized below:

\[
V_T = M_p g \frac{l}{p} \cos(\alpha(t)) \tag{5}
\]

The amount of energy in a system due to its motion is measured by the kinetic energy. Hence, the total kinetic energy can be depicted as follows:
\[ \frac{\partial L}{\partial \dot{q}_i} = \tau_i - \frac{\partial T}{\partial q_i} \]

Where \( L \) is the Lagrangian, \( \dot{q}_i \) is the \( i \)-th generalized velocity, \( \tau_i \) is the \( i \)-th generalized force, \( T \) is the total kinetic energy of the system, and \( q_i \) is the \( i \)-th generalized coordinate.

The total kinetic energy of the pendulum, \( T_p \), is the sum of translational kinetic energy, \( T_{pt} \), and rotational kinetic energy, \( T_{pr} \).

\[ T_p = T_{pt} + T_{pr} = \frac{1}{2} M_p \dot{x}_p^2 + \frac{1}{2} I_p \dot{\alpha}_p^2 (t) \]

Where \( M_p = M + (J_m K g / r_{mp}) \)

The total kinetic energy of the pendulum, \( T_p \), is the sum of translational kinetic energy, \( T_{pt} \), and rotational kinetic energy, \( T_{pr} \).

\[ T_p = T_{pt} + T_{pr} = \frac{1}{2} M_p \dot{x}_p^2 + \frac{1}{2} I_p \dot{\alpha}_p^2 (t) \]

Where \( J_{mp} = \frac{1}{2} I_m + M_p l_p^2 \).

From equation (1) and (2), the nonlinear equation of motion can be obtained as:

\[ \frac{d^2 \dot{x}_c}{dt^2} + \frac{1}{2} (I_0 + M_p l_p^2) \dot{\alpha}_c(t) + M_p g l_p \sin(\alpha(t)) = F_c(t) \]

The nonlinear model can be linearized around the equilibrium point (upright pendulum) so that \( \sin(\alpha) \approx \alpha \) and \( \cos(\alpha) \approx 1 \). The design of state feedback controller requires the mathematical model of the system in state space form. Thus the linearized model of inverted pendulum in state space form can be written as:

\[ \dot{X} = AX + BU \]
\[ Y = CX \]

Where \( X = [x_c \times \dot{x}_c \times \alpha]^T \), \( U = \dot{V} \) and \( Y = [x_c \times \alpha]^T \).
\[
A = \begin{bmatrix}
0 & 0 & 1 & 0 \\
0 & 0 & 0 & 1 \\
0 & \frac{(M_p l)^2 - 2 B_{eq} (M_p l)^2 + I}{M_p l B_p} & 0 & \frac{B_{eq} (M_p l)^2}{M_p l B_p} \\
0 & \frac{(M + M_p) M_p g l}{q} & \frac{M_p B_{eq}}{q} & \frac{(M + M_p) B_{eq}}{q}
\end{bmatrix}
\]

\[
B = \begin{bmatrix}
0 \\
0 \\
M_p l^2 + I \\
M_p l
\end{bmatrix}
\]

Table 1. List of Parameters

<table>
<thead>
<tr>
<th>Symbol</th>
<th>Description</th>
<th>Value/Unit</th>
</tr>
</thead>
<tbody>
<tr>
<td>R</td>
<td>Motor armature resistance</td>
<td>2.6Ω</td>
</tr>
<tr>
<td>L</td>
<td>Motor armature inductance</td>
<td>0.18mH</td>
</tr>
<tr>
<td>Κₗ</td>
<td>Motor torque constant</td>
<td>0.00767 Nm/A</td>
</tr>
<tr>
<td>ηₗ</td>
<td>Motor efficiency</td>
<td>100%</td>
</tr>
<tr>
<td>Κₘ</td>
<td>Motor EMF constant</td>
<td>0.00767 Ns/rad</td>
</tr>
<tr>
<td>J</td>
<td>Rotor moment of inertia</td>
<td>3.9x10⁻⁷ kg²</td>
</tr>
<tr>
<td>Kₔ</td>
<td>Gearbox ratio</td>
<td>3.71</td>
</tr>
<tr>
<td>ηₖ</td>
<td>Gearbox efficiency</td>
<td>100%</td>
</tr>
<tr>
<td>rₘ</td>
<td>Motor pinion radius</td>
<td>6.35x10⁻¹ m</td>
</tr>
<tr>
<td>rₚ</td>
<td>Position pinion radius</td>
<td>1.48x10⁻² m</td>
</tr>
<tr>
<td>Bₐq</td>
<td>Equivalent viscous damping coefficient at motor</td>
<td>5.4 Nm/rad</td>
</tr>
<tr>
<td>Bₚ</td>
<td>Viscous damping coefficient at pendulum pivot</td>
<td>5.4 Nm/rad</td>
</tr>
<tr>
<td>l</td>
<td>Pendulum length from pivot to centre of mass</td>
<td>0.3302 m</td>
</tr>
<tr>
<td>I</td>
<td>Pendulum moment of inertia</td>
<td>7.88x10⁻³ kg²</td>
</tr>
<tr>
<td>Mₚ</td>
<td>Pendulum mass</td>
<td>0.23kg</td>
</tr>
<tr>
<td>M</td>
<td>Cart mass</td>
<td>0.94kg</td>
</tr>
<tr>
<td>Vₘ</td>
<td>Motor nominal input voltage</td>
<td>5V</td>
</tr>
</tbody>
</table>

Substituting the parameters given in Table 1 into (17), results in the following state model.

\[
\begin{bmatrix}
\dot{x}_c \\
\ddot{x}_c \\
\dot{\alpha} \\
\ddot{\alpha}
\end{bmatrix} = \begin{bmatrix}
0 & 0 & 1 & 0 \\
0 & 0 & 0 & 1 \\
0 & 2.2643 & -15.8866 & -0.0073 \\
0 & 27.8203 & -36.6044 & -0.0896
\end{bmatrix} \begin{bmatrix}
x_c \\
\alpha \\
\dot{x}_c \\
\dot{\alpha}
\end{bmatrix} + \begin{bmatrix}
0 \\
0 \\
2.2772 \\
5.2470
\end{bmatrix} u
\]

(18)

\[
y = \begin{bmatrix}
1 & 0 & 0 & 0 \\
0 & 1 & 0 & 0 \\
0 & 0 & 1 & 0 \\
0 & 0 & 0 & 1
\end{bmatrix} \begin{bmatrix}
x_c \\
\alpha \\
\dot{x}_c \\
\ddot{\alpha}
\end{bmatrix}
\]

(19)

The eigen values of the system matrix are -16.2577, -4.5611, 0, 4.8426. It can be clearly seen that the open loop system has one pole in the Right Half Plane (RHP) i.e., positive pole. Therefore the system is unstable in open loop. As a consequence, in order to maintain the pendulum balanced in the inverted position, a controller is to be designed such that all the resulting closed loop poles lie in the Left Half Plane (LHP).

3. Formulation of Controller Design Problem

The controller design for the inverted pendulum system is broken up into two components. The first part involves the design of a swing up controller that swings the pendulum up to the unstable equilibrium. The second part involves the design of an optimal state feedback controller that will stabilize the pendulum around the upright position. When the pendulum approaches the linearized point, the control will switch to the stabilizing controller which will balance the pendulum around the vertical position. The control scheme of SESIP consists of two main control loops and a decision making logic to switch between the two control schemes. The control scheme of the...
inverted pendulum is shown in Fig. 3. One of the two control loops is a PV controller on the cart position that follows a set point designed to swing up the pendulum from the suspended to the inverted posture [10]. The other control loop is active when the pendulum is around the upright position and consists of a Linear Quadratic Regulator, maintaining the inverted pendulum in vertical position. The primary objective of the LQR scheme is to catch, in a first time, “swing-up” pendulum and then to maintain it balanced in the inverted posture. The linear cart should track a desired (square wave) position set point and at the same time the controller should also minimize the control effort.

![Diagram of Control Scheme](image)

The gain of the LQR scheme is tuned to control the inverted pendulum and linear cart system to satisfy the following design requirements.

1. The pendulum angle should be regulated around its upright position and never exceed a ±1 degree deflection.
2. Rise time ≤ 2
3. Control effort $V_m$ should be minimum and is not allowed to reach the saturation level.

4. Controller design

4.1 PV Controller

This controller aims at swinging up the pendulum from rest ($\alpha=180^\circ=\n 180^\circ$) while keeping the cart travels within the limited horizontal distance. Many different control algorithms can be used to perform the swing up control such as, trajectory tracking, rectangular reference input swing up type and Pulse Width Modulation (PWM) [11]. In this work, a PV controller is used because of its simple structure, effectiveness and easy tuning. The block diagram representation of swing up controller is shown in Fig. 4. The proportional velocity position controller for servo plant introduces two corrective terms. One is proportional ($K_p$) to the cart position error while the other is proportional ($K_v$) to the cart velocity. The resulting PV control law is given as:

$$V_m(t) = K_p (x_d(t) - x_c(t)) + K_v \left( \frac{d}{dt} x_c(t) \right)$$

(20)

The closed loop transfer function of the cart servo can be expressed as:

$$\frac{x_c(s)}{x_d(s)} = \frac{K_p G(s)}{1 + K_p G(s) + sK_v G(s)}$$

(21)

This leads to a second order system as follows:

$$\frac{x_c(s)}{x_d(s)} = \frac{1.6K_p}{s^2 + s(12.23 + 1.6K_v) + 1.6K_p}$$

(22)

The desired performance is $\zeta=0.59$ and $\omega=26$ rad/s. Comparing characteristic equation in (22) with the standard second order form:

$$s^2 + 2\zeta\omega_n s + \omega_n^2 = 0$$

(23)

the PV controller gains are obtained as $K_v = 274$ and $K_v = 5$. 

4.2 LQR Controller

The LQR method is a powerful technique for designing controllers for complex systems that have stringent performance requirements and it seeks to find the optimal controller that minimizes a given cost function [12]. The cost function is parameterized by two matrices, Q and R, that weight the state vector and the system input respectively. LQR method is based on the state-space model and it tries to obtain the optimal control input by solving the algebraic Riccati equation. In this paper, the state feedback controller is designed using the linear quadratic regulator and the linear model of the system. Briefly, the LQR/LTR theory says that, given an \( n \)th order stabilizable system

\[
\begin{align*}
\dot{x}(t) &= Ax(t) + Bu(t) \quad t \geq 0, \quad x(0) = x_0
\end{align*}
\]

Where \( x(t) \) is the state vector and \( u(t) \) is the input vector, determine the matrix \( K \in \mathbb{R}^{nxm} \) such that the static, full state feedback control law,

\[
Kx(t) = u(t) = -Kx(t)
\]

satisfies the following criteria,

a. the closed-loop system is asymptotically stable
b. the quadratic performance functional

and the cost function

\[
J(K) = \frac{1}{2} \int_0^\infty [x^T(t)Qx(t) + u^T(t)Ru(t)] dt
\]

is minimized. Q is a nonnegative definite matrix that penalizes the departure of system states from the equilibrium, and R is a positive definite matrix that penalizes the control input [13]. The following LQR design algorithm is used to determine the optimal state feedback.

**Step 1:** Solve the matrix Algebraic Riccati Equation (ARE)

\[
-PA - A^T P - Q + PBR^{-1}B^T P = 0
\]

**Step 2:** Determine the optimal state \( x^*(t) \) from

\[
x^*(t) = \left[ A - BR^{-1}B^T P \right] x(t)
\]

**Step 3:** Obtain the optimal control \( u^*(t) \) from

\[
u^*(t) = -R^{-1}B^T P x^*(t)
\]

**Step 4:** Obtain the optimal performance index from

\[
J^* = \frac{1}{2} x^*^T (t)Px(t)
\]

The weighting matrices Q and R are important components of an LQR optimization process. The compositions of Q and R elements have great influences on system performance. The designer is free to select the matrices Q and R, but the selection of matrices Q and R is normally based on an iterative procedure using experience and physical understanding of the problems involved.

5. Experimental Results

In order to show the practical effectiveness of the proposed scheme, experiments are conducted using Quanser IP-02 inverted pendulum system. The snapshot of the experimental set up is shown in Fig. 5. Firstly, the experimental results of two phases of swing up and stabilizing modes are presented. Secondly, the performance of robust LQR controller design is compared with FSF controller.
Real time experiment configuration consists of computer with MATLAB, Simulink, Q8 data acquisition board and Quanser IP02 Linear inverted pendulum module. The controller gains of a state feedback controller are determined using the weighting matrices of linear quadratic regulator. The following weighting matrices are selected based on iterative method for the calculation of state feedback gain $K$.

$$
Q = \begin{bmatrix}
0.5 & 0 & 0 & 0 \\
0 & 5.5 & 0 & 0 \\
0 & 0 & 0 & 0 \\
0 & 0 & 0 & 0
\end{bmatrix}
$$

$$
R = \begin{bmatrix}
0.0003
\end{bmatrix}
$$

Using the system model from (18) and the above weighting matrices, the state feedback controller gains obtained for robust LQR controller is

$$
K = \begin{bmatrix}
-44.72 & 200.8 & -49.77 & 27.38
\end{bmatrix}
$$

The closed loop poles of the system are found to be

$$
s_1 = -6.04 + j10.84, s_2 = -6.04 - j10.84, s_3 = -2.97, s_4 = -2.10
$$

It can be inferred from the above pole locations that the closed loop system is stable because all the poles are located on the LHP. Fig. 6 shows the output of the swing up controller which is able to bring the pendulum to upright position in around 7 sec. The swing up controller takes approximately 12 swings before the pendulum reaches close to vertical position. During the swing up phase, the magnitude of control signal is larger than that of the stabilizing phase. This is relevant because large amount of energy is required to swing the pendulum from downward position to its upright position and the small amount of energy is only required to stabilize the pendulum. The control signal applied to the cart is shown in Fig. 7. Even though the initial control signal during swing up phase reaches the maximum saturation level, the magnitude of control voltage applied to the motor is reduced well below 3.3V after the pendulum reaches the upright position.
5.1 Disturbance rejection

The disturbance rejection ability of the controller strategy is explained in this section. After the pendulum swing up and stabilization phase, disturbance is introduced into the pendulum at 15th second as shown in Fig. 8. The zoomed view of pendulum velocity response is shown in Fig. 9 to highlight the magnitude of deviation in angle. The magnitude of pendulum velocity deviates to a maximum of 60 deg when the disturbance signal is introduced, but the controller is able to reduce the oscillation in less than 2 seconds which makes the pendulum to maintain its upright position to track the given signal.

5.2 Dynamic performance assessment of FSF and LQR controllers

Dynamic performance indices such as rise time, settling time and overshoot are chosen to evaluate the performance of both LQR and FSF controllers for the response of cart position and pendulum angle. The state feedback gain matrix for the FSF controller design is calculated using Ackermans’s formula and the response of FSF controller is compared with that of the LQR controller. Fig. 10 and 11 show the response of cart position and pendulum angle, respectively. Based on the performance indices given in Table 2, it is worth to note that the LQR controller has less rise time and reaches the set point quickly compare to FSF controller. LQR controller is also characterized by a reduced overshoot and short delay time. In summary, for dynamic response, the inverted pendulum controlled by LQR controller 1) balances faster because of the shorter settling time; 2) has better robustness due to less maximum overshoot. The above points substantiates for the fact that the LQR controller can guarantee the inverted pendulum system a better dynamic performance than a FSF controller.
6. Conclusion

In this paper, a control strategy based on PV controller and robust LQR controller has been proposed for swing up and stabilization of an inverted pendulum. The mathematical model of an inverted pendulum has been obtained using Euler-Lagrangean principles. A PV controller based on energy based method has been implemented to swing up the pendulum to upright position. Once the pendulum reaches the vertical position, a stabilizing controller based on robust LQR is activated to catch the pendulum and to make it track the given reference signal. In order to show the effectiveness of the proposed control scheme, disturbance signal has been introduced into system and the ability of the controller to arrest the oscillation in shorter time period has been experimentally demonstrated. Furthermore, experimental results show that the steady state performance of the proposed LQR controller has smaller oscillation amplitude than that of the FSF controller. The control scheme had not only good dynamic performance, but also robustness to external disturbance. As a future work, in order to further reduce the oscillation amplitude and frequency, friction compensation schemes can be incorporated in the controller strategy.

References