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Robust Control of Electrified Turbocharged Diesel Engines

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Abstract—Electrified turbocharger is a critical technology for engine downsizing and is a cost-effective solution for exhaust gas energy recovery. In conventional turbocharged diesel engines, the air path holds strong nonlinearity since the actuators are all driven by the exhaust gas. In an electrified turbocharged diesel engine (ETDE), the coupling is more complex, due to the electric machine mounted on the turbine shaft impacts the exhaust manifold dynamics as well. In distributed single-input single-output control methods, the gains tuning is time consuming and the couplings are ignored. To control the performance variables independently, developing a promising multi-input multi-output control method for the ETDE is essential. In this paper, a model-based multi variable robust controller is designed to control the performance variables in a systematic way. Both simulation and experimental results verified the effectiveness of the proposed controller.

I. INTRODUCTION

In the Paris Climate Change Conference 2015, countries of the world have made an agreement that to limit the global average temperature increase below 2 °C, with an aspiration of below 1.5 °C above the pre-industrial level [1]. Hard efforts need to do to reduce greenhouse gas (GHG) emissions effectively in the following decades. Transportation sector accounts for about a quarter of GHG emissions and a half of global oil consumption, which is the the second largest source of GHG emissions [2]. The fuel consumption reduction in transportation sector is a global critical issue.

Engine downsizing is proven as the most promising approach in fuel consumption reduction [3]–[5], which uses a smaller capacity engine to provide the power of a larger engine. The downsized engine allows a larger area of its operating range to be more efficiently used for most of the time, since the average engine operating points become closer to its high fuel efficiency zone. At high loads, the loss of reduced engine displacement is compensated by effective air charging. Variable geometry turbocharger (VGT) is an effective turbocharging technology, which has been widely used in modern diesel engines. The VGT can provide power to drive the compressor running at different desired boost levels by tuning the effective nozzle area. In VGT-equipped engines, for part of the exhaust gas energy is used to accelerate the turbine shaft speed for boosting, both engine transient response and fuel economy are improved. However, the turbo-lag in the VGT is still non-negligible. To overcome the transient performance limitations, a fast boosting system is required to work cooperating with the VGT [6], which is the motivation for the electrification of turbo-machinery [7]. The electrified turbocharger is the cutting edge e-boosting system for its high efficiency.

The electrified turbocharger has an electric motor/generator (EMG) mounted on the turbine shaft, as shown in Fig. 1. At low engine speeds, the energy is used to assist the turbine shaft. In this case the electrified turbocharger works as a power assist system and therefore, the turbo-lag is greatly minimized. At engine high power regions, the energy is extracted from the turbine shaft to the energy storage, which indicates part of the exhaust gas energy is recovered. The energy storage is placed as a buffer that either supplies energy to assist the compressor or absorbs energy from the exhaust gas. Compared with the electric turbocompounding, the electrified turbocharger has less pumping losses in the initial phase and less mechanical losses. Therefore, the electrified turbocharger is seen as the prime candidate for the electrification of turbo-machinery. The mainstream diesel engine and turbocharger manufacturers have developed [8]–[10] or are developing their own prototype electrified turbochargers [11], as shown in Fig. 2.

Developing effective control methods for electrified turbochargers is critical to explore the maximum potential of downsized engines. Although some efficiency mapping work have been done in experiments [12]–[16], a proper control solution is still lacking. A multi-variable control framework of an electrified turbocharged diesel engine (ETDE) is proposed in this paper, and it is successfully validated on a state-of-the-art electrified engine test chassis.
The paper is organized as follows. After the introduction in section I, the ETDE model is described in section II. The controller design is presented in section III. Experimental validation results are demonstrated in section IV. Finally, the conclusions are summarized in section V.

II. SYSTEM DESCRIPTION AND CHARACTERIZATION

The layout of the ETDE is illustrated as Fig. 3, while the essential variables is listed in Table I. The electrified turbocharger is composed of a compressor, a turbine, and an EM on the turbine shaft. The turbine takes exhaust gas energy to power the compressor for fresh air delivery. The EGR loop feeds back part of exhaust gas to the intake manifold, to lower the combustion temperature for NOx reduction. The control-oriented mean value model of a turbocharged diesel engine can be found in [17]. The EM can be used to accelerate or decelerate the turbine speed, so it is also called the electric turbo assist (ETA). A switched reluctance motor (SRM) is selected as the EM for it is an excellent option in extra-high speed applications thanks to its simple structure. The simple SRM structure results in a high rotor temperature capability and no concern about the high cost of rare-earth materials. The ETA can work in both assisting (motoring) mode and harvesting (generating) mode. In assisting mode, the ETA extracts energy from the battery to assist boosting. In harvesting mode, the additional turbine torque resulting from exceed exhaust energy causes a power flow to the battery.

The dynamics of the turbocharger can be modeled as a first-order lag power transfer function with time constant $\tau$:

$$\dot{P}_c = \frac{1}{\tau} \left( P_t + P_{em} - P_{bd} - P_{wl} - P_{bl} - P_c \right).$$

Using the mechanical efficiency to represent energy losses, (1) can be represented as

$$\dot{P}_c = \frac{1}{\tau} \left( \eta_m (P_t + P_{em}) - P_c \right).$$

$W_c$ is related to $P_c$ by

$$W_c = \frac{\eta_c}{c_p T_{am}} \frac{P_c}{\left( \frac{p_{am}}{p_{exh}} \right) - 1},$$

and $P_t$ can be expressed by $W_t$:

$$P_t = \eta_c c_p T_{exh} \left( 1 - \left( \frac{p_{am}}{p_{exh}} \right)^\mu \right) W_t.$$

The key in the control of the diesel engine to follow exhaust emission regulations is keeping fair values of air-fuel ratio and EGR fraction. In the air path variables of the ETDE, $p_{in}$ and $p_{exh}$ determine the amount of gas to boost the compressor for fresh air delivery, and $W_{egr}$ decides...
the amount of feedback exhaust gas. Therefore, the control variables are selected as

\[ y = [p_{in}, \ p_{exh}, \ W_{egr}]^T, \]  

with the control inputs of

\[ u = [\chi_{vgt}, \ P_{em}, \ \chi_{egr}]^T. \]  

By regulating each element in \( y \) independently, the desired air path dynamics of the ETDE is expected to achieve in both transients and steady states.

**III. ROBUST CONTROLLER DESIGN**

The single-input single-output (SISO) proportional-integral (PI) controllers are widely used in the control of conventional turbocharged diesel engines, while \( p_{in} \) and \( W_{egr} \) are controlled by \( \chi_{vgt} \) and \( \chi_{egr} \), respectively. The gain values of PI controllers are generally tuned in off-line calibration. However, in the ETDE, the dynamics have been significantly changed, therefore the controllers require to be re-designed, which is a time-consuming work. Considering strong internal interactions among different loops, designing a model-based decoupling multi-input multi-output (MIMO) controller is a feasible approach. The \( H_\infty \) control is employed to build the decoupling controller for its advantages over internal couplings.

**A. Control Problem Formulation**

\[ \Delta P(s) \]
\[ y^* \]
\[ K(s) \]
\[ u \]
\[ P(s) \]
\[ y \]

Fig. 4. Closed loop control diagram

A general closed loop control diagram is shown as Fig. 4. It is expected that the system can behave both high performance and high robustness in face of model uncertainty \( \Delta P(s) \) and measurement noise \( w \). The transfer function from \( w \) to \( y \) is denoted as the sensitivity function \( S(s) \):

\[ S(s) = 1/(1 + K(s)P(s)) , \]  

with \( P(s) \) and \( K(s) \) are the transfer functions of plant and controller, respectively. The transfer function from reference \( y^* \) to output \( y \) is \( G(s) \), which can also be denoted as the complementary sensitivity function:

\[ T(s) = K(s)P(s)/(1 + K(s)P(s)) , \]  

while the loop function is defined as

\[ L(s) = K(s)P(s). \]  

From the physical point of view, reference commands normally consist of low frequency components. In contrast, unmodelled dynamics, model uncertainties, and noises are mainly composed by high frequency components. To keep the balance between robustness and performance, \( S(s) \) should be small at low frequencies for good tracking, and \( T(s) \) should be small at high frequencies for good noise rejection [18]. The controller \( K(s) \) is to be designed such that:

\[ \min_{K(s)} \gamma : \sigma \left[ T(s) \right] < \gamma, \]  

where \( \sigma \) denotes the maximum singular value, and \( \gamma \) is the upper limit. This is to solve a \( H_\infty \) problem and very applicable in MIMO systems. Since \( S(s) + T(s) = 1 \) is held for all frequencies, the control problem is translated to the design of the open-loop transfer function such that \( \left| L(s) \right| \gg 1 \) in low frequencies, and \( \left| L(s) \right| \ll 1 \) in high frequencies. Therefore, the control problem is further transferred to set the proper value on crossover frequency for both strong disturbance attenuation (for tracking) and high robust stability (for noise rejection) [19]. It is expected to design a suitable \( L(s) \) with the specified crossover frequency \( \omega_c \) and the approach is called \( H_\infty \) loop shaping. However, in a MIMO system, the \( L(s) \) has multiple trajectories. Therefore, designing a \( L(s) \) locating within upper and lower bounds for all frequencies is a more feasible approach.

**B. Model Identification**

The state space model of the ETDE is to be identified from the time domain data, where the model order and coefficient matrices are both to be determined. As an example, the model identification at the operating point of 1800 rpm and 260 Nm is illustrated in Fig. 5. The calibration has continued for 800 seconds, while the action ranges of \( \chi_{vgt} \), \( P_{em} \), and \( \chi_{egr} \) are limited as \([0.2, \ 0.8] \), \([-1.5 \ kW, \ 1.5 \ kW] \), and \([0, \ 0.3] \), respectively. In the model generation and validation, the first half 400 seconds data are used for training and the latter half 400 seconds data are used for validation. By comparing the fitting results, a third-order model with the highest score is selected as the proper model at the specified operating point. The fitting score on \( p_{in} \), \( p_{exh} \), and \( W_{egr} \) are 81%, 79%, and 73%, respectively.
C. Controller Synthesis

Based on the identified coefficient matrices, the transfer function of the ETDE model is given as

\[ P(s) = C(sI - A)^{-1} B + D. \]  \hspace{1cm} (11)

The control target is to design a \( K(s) \) such that \( G(s) \approx 1 \) at low frequencies and \( G(s) \gg 1 \) at high frequencies. In the \( H_\infty \) loop shaping controller design, a pre-scaling matrix \( S_1 \) and a post-scaling matrix \( S_2 \) are applied on \( P(s) \) to make sure that each input and output are treated equivalently in the MIMO system:

\[ P_s(s) = S_2 P(s) S_1. \]  \hspace{1cm} (12)

The singular values of the scaled plant \( P_s(s) \) are shaped using a pre-compensator \( W_1 \) and a post-compensator \( W_2 \) to get the desired loop shape [20], [21]. The weighted plant model is

\[ P_w(s) = W_2 P_s(s) W_1. \]  \hspace{1cm} (13)

An optimal stabilizing controller \( K_\infty \) is to be designed to minimize the singular value such that [22]:

\[ \gamma_{opt} = \min_{K_\infty} \left\| \begin{bmatrix} K_\infty & I \end{bmatrix} (I - P_w K_\infty)^{-1} \begin{bmatrix} P_w & I \end{bmatrix} \right\|. \]  \hspace{1cm} (14)

The final controller \( K(s) \) is constructed by combining \( K_\infty \), \( W_1 \), \( W_2 \), \( S_1 \), and \( S_2 \):

\[ K = W_1 S_1 K_\infty S_2 W_2. \]  \hspace{1cm} (15)

The \( H_\infty \) loop shaping controller is designed in the form of decoupling PI controllers, as shown in Fig. 6, where \( p_{in}, p_{exh}, \) and \( W_{egr} \) are the setpoints of \( p_{in}, p_{exh}, \) and \( W_{egr} \), respectively. According to engineering experiences, the crossover frequencies of all loops are specified in the band of

\[ \omega_c \in [1 \text{ rad/s}, \ 10 \text{ rad/s}]. \]  \hspace{1cm} (16)

The controller is performed in a Simulink setup via the use of Matlab function \textit{looptune} provided in the Robust Control Toolbox. The Bode diagram of the original ETDE model \( P(s) \) and the resulting closed loop transfer function \( G(s) \) at 1800 rpm, 260 Nm are shown in Fig. 7. The loop shaping results show that the closed loop response is close to 0 dB/decade at low frequencies and roll off with a high rate at high frequencies, indicating the shaped closed loop control system achieves both strong noise attenuation performance and high stability.

IV. SIMULATION RESULTS

Prior to the experiments, the controller has been validated on an ETDE mean value model in Simulink, while the model is identified from calibration data on a heavy-duty ETDE in the test cell. The engine operating point is selected as 1800 rpm, 260 Nm, while the engine model at this point has been identified in Section V. Using the Matlab command \textit{looptune}, the decoupling matrix, together with the proportional and integral gains of the PI controllers in the 3 loops are built as following:

\[ D_c = \begin{bmatrix} -0.0774 & 0.0606 & -47.46 \\ 0.0757 & -0.0092 & 18.4 \\ 0.4879 & 0.0987 & 602.8 \end{bmatrix}, \]

\[ K_P = \begin{bmatrix} -0.0007 & 0.0725 & 0.0005 \end{bmatrix}^T, \]

\[ K_I = \begin{bmatrix} 0.776 \\ 3.8 \\ 0.0272 \end{bmatrix}^T. \]

The initial values of the setpoints are chosen as

\[ y^* = [150 \text{ kPa} \ 200 \text{ kPa} \ 0.02 \text{ kg/s}]^T. \]

Step changes on the command signals are made on \( p_{in}, p_{exh}, \) and \( W_{egr} \) at 10 s, 20 s, and 30 s, respectively. After the step changes, the command values are

\[ y^* = [190 \text{ kPa} \ 260 \text{ kPa} \ 0.03 \text{ kg/s}]^T. \]

The tracking performance is evaluated in Fig. 8. All the performance variables are tracked fast and accurately. When step changes occur on command values, small spikes are observed but the trajectories are attracted to the updated command values quickly. The controller addresses the tracking of multiple variables in a systematic manner. The simulation results validate the effectiveness of the proposed controller, and build the confidence to expand to experimental tests.

V. EXPERIMENTAL RESULTS

The experimental platform is shown as Fig. 9. The investigated engine is a six-cylinder, 7.01-L heavy-duty engine with rated power of 225 kW at 2200 rpm and a rated
torque of 1280 Nm at 1400 rpm. The engine is fitted with an ETA and a high pressure loop cooled EGR. The ETA was developed by a consortium led by Caterpillar. Based on the ETA, several control methods and testing systems were developed in Loughborough University in simulations [23]–[25] and experiments [26].

The tracking performance of the proposed 3-input 3-output (3I3O) controller at 1800 rpm, 260 Nm is illustrated in Fig. 10. At the initial stage, step changes are set on $p_{in}^*$ between 30 kPa and 60 kPa, while the other setpoints are kept as constants. The control laws are changing fast to respond the change on $p_{in}^*$. When $p_{in}^*$ drops from 60 kPa to 30 kPa, $\chi_{vgt}$ increases immediately, while $P_{em}$ is pushed from motoring mode into generating mode. At the same time, $\chi_{egr}$ reduces slightly. The actuators work together to achieve a low $p_{in}$. When $W_{egr}$ changes from 100 kg/h to around 0 kg/h at about 180 s, $\chi_{egr}$ is forced to shut off. Meanwhile, closing $\chi_{vgt}$ and increasing $P_{em}$ both guarantee the steady value of $p_{in}$ and $p_{exh}$. When $p_{exh}$ drops from 95 kPa to 80 kPa at 360 s, the controller reduces $\chi_{vgt}$ and increases $\chi_{egr}$ to achieve lower $p_{exh}$. In additional, $P_{em}$ is increased to maintain $p_{in}$. The tracking performance is desirable with variable setpoints on control variables.

Fig. 8. Tracking performance evaluation in simulation

VI. CONCLUSIONS

A model-based MIMO robust decoupling controller of a newly designed ETDE is given in this paper. Stability margins are considered in building the controller and therefore, strong robustness is held. The proposed controller showed excellent tracking performance in both transients and steady states and is applicable in industrial applications. Experimental results strongly support the effectiveness of the the proposed controller. This work effectively underpin the next stage real-time optimization on fuel economy of ETDE.

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REFERENCES

Fig. 10. Tracking performance of the 3DO robust controller with variable setpoints at 1800rpm, 260Nm


