

Characterisation, control, and energy management of electrified turbocharged diesel engines

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Abstract

The electrification of engine components offers significant opportunities for fuel efficiency improvements. The electrified turbocharger is one of the most attractive options since it recovers part of the engine exhaust gas mechanical energy to assist boosting. Therefore, the engine can be downsized through improved transient responsiveness. In the electrified turbocharger, an electric machine is mounted on the turbine shaft and changes the air system dynamics, so characterisation of the new layout is essential. A systematic control solution is required to manage energy flows in the hybrid system. In this paper, a framework for characterisation, control, and energy management for an electrified turbocharged diesel engine is proposed. The impacts of the electric machine on fuel economy and air system variables are analysed. Based on the characterisation, a two-level control structure is proposed. A real-time energy management strategy is employed as the supervisory level controller to generate the optimal values of critical variables, while a model-based multi-variable controller is designed as the low level controller to track the values. The two controllers work together in a cascade to address both fuel economy optimisation and battery state-of-charge maintenance. The proposed control strategy is validated on a high fidelity physical engine model. The tracking performance shows the proposed framework is a promising solution in regulating the behavior of electrified engines.

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Electrified turbocharged diesel engines, energy management, real-time optimisation, multi-variable control

Highlights

- A real-time energy management framework for electrified engines is proposed.
- A multi-variable robust controller is designed.
- Characterisation on the air system of electrified diesel engines is given.
- Reliable for engine downsizing because of the promising transient performance.

1. Introduction

Fuel saving in the transportation is a global critical issue. The transportation sector is the second largest source of greenhouse gas generation and consumes a half of crude oil. In most developed countries, a clear target in improving fuel efficiency of the vehicles has been made by legislation and policies [1]. Engine downsizing offers promising fuel economy improvements by the reduction of friction, thermal losses, and mass [2]. It allows the engine to run in a more fuel-efficient region [3]. The reduced displacement of the downsized engine can be compensated by injecting more fresh air into the cylinder for better combustion [4]. Better air delivery is feasible now by turbocharging, where the state-of-the-art technology is the electrified turbocharger [5]. In the electrified turbocharger, an extra-high speed electric machine (EM) is mounted on the turbine shaft. In periods of speed acceleration or load acceptance, the EM can run as a motor to augment the turbine power to the compressor and, therefore, increase the flow fresh air from the compressor to improve engine performance. This is achieved through either increased availability of combustion air or a reduction in pre-turbine back pressure. In specific engine operating regions, the fuel economy benefit of using an electrified turbocharger is up to 10% [6]. Compared with feeding energy to the crankshaft, the electrified turbocharger is more efficient in improving fuel efficiency for the mechanical losses are reduced [7]. The EM can also run as a generator when exhaust gas power excess the requirement on the compressor side. Several other waste energy recovery technologies are also being developed, where the typical solutions are Organic Rankine Cycle (ORC) and thermal electric generator (TEG). As for the ORC, the major obstacles in installing it on ground vehicles are its high cost and systems complexity [8]. As for the TEG, breakthroughs on the bottlenecks of expensive materials and low energy conversion efficiency are still being expected [9]. The electrified turbochargers gains their popularity since it is easy to assemble and more cost effective [10].

Diesel engines are predominantly used in heavy-duty vehicles and therefore their downsizing would be essential for reducing total fuel consumption [11]. The electrified turbocharger offers a promising solution for the effective air charging of diesel engines. Several prototypes are being developed by leading diesel engine and turbocharger suppliers. In 2003, Caterpillar demonstrated the fuel economy benefit of using the electric turbocompounding on heavy-duty engines [12]. In 2005, Honeywell reported the improvements of fuel economy and transient response using the electric boosting system [13]. In 2006, Mitsubishi developed a hybrid turbo that achieves better combustion, purer exhaust gas, and improved torque response [14]. In academic pioneer works, theoretical analysis and experimental evaluations on the potential of using an electrified turbocharger in fuel economy benefit, exhaust emissions reduction, and torque enhancement are all investigated. The theoretical analysis is given in [15], where an optimisation problem is formulated and solved numerically. The experimental evaluations are given in [16], where the turbo-lag reduction in several typical driving cycles are analysed. The comparison of the transient response improvement using an electrified turbocharger and using an electric turbocompounding is given in [17]. The electrified turbocharger with a different configuration, such as a two-stage electrified turbocharger, is investigated in [18]. In 2014, a consortium led by Caterpillar developed an entirely new electrified turbocharger for heavy-duty diesel engines, called the electric turbo assist (ETA). The characterisation of the ETA has been fulfilled through both simulations and experiments. In [19], the potential of the ETA to reduce fuel consumption by both engine downspeeding and exhaust energy recovery is elaborated in steady states via simulations. In [20], the simulation studies are generalised to transient conditions. In experiments, the mathematical modeling is investigated in [21]. Furthermore, an efficiency mapping work is given in [22]. The improvements in engine energy efficiency and transient response in experiments are covered in [23]. The key issue in the success of an electrified turbocharged diesel engine (ETDE) is online management of energy flows. First of all, the timing control of the EM to work in the generating mode or the motoring mode is necessary. Furthermore, how much power should be applied or extracted needs to be known precisely. Finally at the system level, how the EM works in co-operation with other actuators is fundamental. The control of an electrified turbocharger is challenging because of couplings among different control loops. In modern turbocharged diesel engines, the VGT reduces fuel consumption and, together with exhaust gas recirculation (EGR), enables a reduction in exhaust emissions, particularly nitrogen oxides (NO_x). VGT and EGR work together to meet the desired burnt gas fraction and air-fuel ratio. The VGT loop and EGR

loop are strongly coupled because the actuators are both in the exhaust gas flow. In an ETDE, the coupling also indicates that the EM affects the exhaust manifold behaviour.

In an ETDE, the selection of control variables is the primary task, for a proper set of control variables can reveal critical engine dynamics [24]. In conventional turbocharged diesel engines, the boost pressure and fresh air flow are normally employed for air system control, with the inputs of VGT opening and EGR opening [25]. Many control methods have been demonstrated on turbocharged diesel engines, which can be mainly categorized into decentralized control and 2-input 2-output (2I2O) centralized control. One of the most influential control methods in decentralized control is linear parameter-varying control [26]. Another typical solution is sliding mode control [27]. On the other side, the most important centralized control method is model predictive control [28]. Recently, fuzzy control has also attracted wide interests[29]. In the ETDE, the EM power is an extra degree of freedom in air system regulation, and therefore, an extra control variable is required to be introduced to reveal the energy balance between fuel and electricity. A 3-input 3-output (3I3O) control structure would be established based on the three actuators and three selected control variables. Some pioneer works on the control of an ETDE have been contributed by the authors. In [30], a 3I3O explicit model predictive control solution is presented. In [31], a 3I3O decoupling control method is demonstrated. In [32], a loop-shaping-based 3I3O robust control method is introduced. However, the general method for selecting control variables is still untouched. This crucial work is regarded as the characterisation of the new layout engine.

After the engine characterisation, the fuel economy optimisation is transformed into the generation and tracking of the optimal values for selected control variables. The choice of these values delivers the optimal performance of the ETDE. The core problem to be highlighted is to identify the best values of all three control variables [33]. This is of practical importance and is common in diesel engines, regardless of the controller type. For the sustainable usage of on-board battery, the maintenance of the battery state-of-charge (SOC) is a critical constraint to be considered. A suitable control and optimisation structure for the ETDE is still to be found. In [34], the actuators are controlled in a rule-based way. However neither the principle of selecting control variables nor the handling of battery SOC constraint has been addressed. This paper presents an attempt to address this gap. The main contributions are:

1. A control-oriented characterisation on the air system of the ETDE is pro-

posed. From this, a clear guideline for the selection of control variables for the ETDE follows.

2. A hierarchical structure for energy management and control is presented. On the supervisory level, the optimal values of control variables are computed to distribute energy flows in the optimal way. On the low level, a multi-input multi-output (MIMO) controller is designed to implement the optimal energy flow distribution.
3. A real-time energy flow management strategy is designed as the supervisory level controller to guarantee the optimisation of fuel economy while keeping the sustainable battery usage.
4. A model-based non-smooth robust controller is designed as the low level controller to regulate the air system dynamics and to address the internal couplings among loops.

To verify the effectiveness of the proposed framework, cross-platform simulations have been carried out on a high fidelity physical plant model built in *Dynasty*, a proprietary multi physics simulation software package developed by Caterpillar. The engine manifolds are modeled as one-dimensional modules, such that the pulsations caused by the engine actuators operation can be captured precisely. To accurately simulate the transient performance, the energy transferred from each cylinder to the turbocharger was modeled separately.

The paper is organized as follows. Following the introduction in section 1, the control problem is formulated in section 2. The ETDE system description is given in section 3, and the control-oriented system characterisation is given in section 4. The low level controller design is presented in section 5, and the supervisory level controller in section 6. Physical simulation results are demonstrated in section 7, followed by conclusions in section 8.

2. Problem Formulation

The framework of characterisation, control, and optimisation is to be built as Fig. 1, while the task of each level is introduced in the following.

2.1. Characterisation

In the system characterisation, the impacts of EM on fuel economy and air system variables are analysed. Based on these analyses, the control variables in

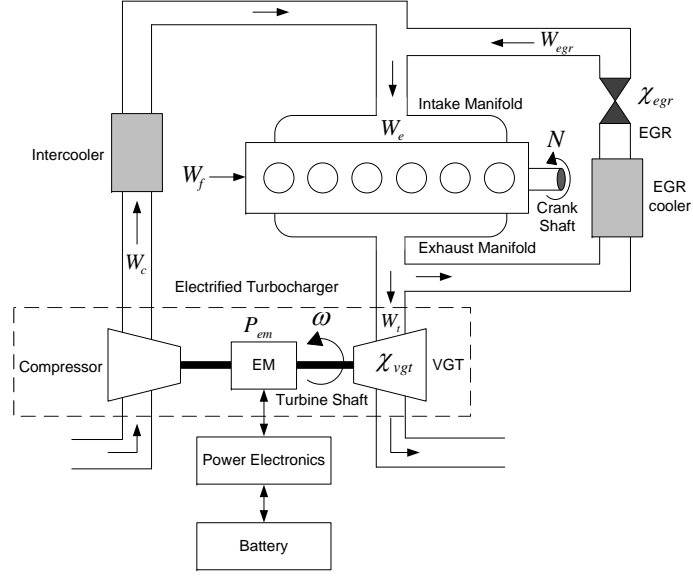


Figure 2: Electrified turbocharged diesel engine

Alternatively, a unified robust controller at a single operating point is expected to be designed.

2.3. Optimisation

Energy flow management is to minimize the total energy consumption of the ETDE in real-time. The burnt fuel power of the engine is

$$P_a = H_{LHV} W_f, \quad (1)$$

where H_{LHV} is the lower heating value of the fuel. In an ETDE, the instantaneous equivalent consumed power is given by

$$P_{eq} = P_a + s(\text{SOC})P_b, \quad (2)$$

where P_b is the battery power, and $s(\text{SOC})$ is an equivalent factor to perform as a necessary penalty on battery SOC deviation.

The cost function is selected as P_{eq} to quantify the equivalent consumed power

$$J(y^*) = P_{eq}, \quad (3)$$

and therefore, the on-line optimisation problem is formulated as

$$\begin{aligned} \underset{y^*}{\text{minimize}} : & \quad J(y^*), \\ \text{subject to} : & \quad y_{\min}^* \leq y^* \leq y_{\max}^*, \end{aligned} \quad (4)$$

where the limits on y^* denote the permissible range of the setpoints set. Considering the constraints on the computational efficiency in real-time engine control, it is more reasonable to generate y^* from a lookup table way, rather than solving an optimal problem on-line.

3. System Description

The schematic of an ETDE is illustrated in Fig. 2, while its variables and related parameters are defined in Table 1. The VGT, EM, and compressor are mounted on the same turbine shaft, comprising the electrified turbocharger. The turbine blades accelerate the turbine shaft to boost fresh air injection through the compressor. The EGR loop feeds part of the burnt gas back to the intake manifold to dilute the fresh air. The mixed air and gas are pumped into the cylinders. In the electrified turbocharger, the EM can assist the turbine shaft when it works in the motoring mode, and can extract energy from turbine shaft to battery in the generating mode.

The engine is a 6-cylinder, 7.01-Litre heavy-duty off-highway engine equipped with a common rail fuel system. The engine produces up to 205 kW at rated speed of 2200 rpm with a peak torque of 1257 Nm at 1400 rpm. An electrical turbocharger with the rated power of 5 kW is fitted to the engine for the purposes of this work. The battery capacity is set as 0.03 kWh considering the balance between usage flexibility and cost. The EM is represented as a map-based model, whose maximum motoring power and generating power are found from a two-dimensional map, with the inputs of ω and power electronics controller setting.

Based on the conservation laws of mass and energy, the engine model is represented by the pressure changes in the intake and exhaust manifolds, and by the change on the turbine speed:

$$\dot{p}_{in} = \frac{R_g \gamma}{V_{in}} (W_c T_c + W_{egr} T_{egr} - W_e T_{in} - \frac{\dot{Q}_1}{c_p}), \quad (5a)$$

$$\dot{p}_{exh} = \frac{R_g \gamma}{V_{exh}} ((W_e + W_f) T_{gas} - (W_{egr} + W_t) T_{exh} - \frac{\dot{Q}_2}{c_p}), \quad (5b)$$

$$\dot{\omega} = \frac{1}{J \omega} (\eta_m (P_t + P_{em}) - P_c). \quad (5c)$$

\dot{Q}_1 and \dot{Q}_2 indicate the heat losses in the intake and exhaust manifolds, respectively [36]. The temperatures are modeled as nonlinear functions, while the coefficients are determined by the materials and geometry of different components

Table 1: Nomenclature

Variable	Description	Unit
N	Engine speed	rpm
T_L	Engine load	Nm
W_f	Engine fuelling rate	kg/s
W_e	Engine total mass flow rate	kg/s
W_c	Compressor air mass flow rate	kg/s
W_{egr}	EGR mass flow rate	kg/s
W_t	Turbine gas mass flow rate	kg/s
P_c	Compressor power	kW
P_t	Turbine power	kW
P_{em}	EM power	kW
p_{in}	Intake manifold pressure	kPa
p_{exh}	Exhaust manifold pressure	kPa
T_{in}	Intake manifold temperature	K
T_{exh}	Exhaust manifold temperature	K
T_{egr}	Mass flow temperature at the EGR outlet	K
T_c	Air temperature at the compressor outlet	K
T_{gas}	Exhaust gas temperature from the engine	K
V_{in}	Intake manifold volume	m ³
V_{exh}	Exhaust manifold volume	m ³
ω	Turbine speed	rpm
J	Turbine shaft moment of inertia	kg/s ²
η_c	Compressor isentropic efficiency	–
η_v	Volumetric efficiency	–
η_m	Turbocharger mechanical efficiency	–
χ_{egr}	EGR valve opening	–
χ_{vgt}	VGT vane opening	–
c_p	Specific heat at constant pressure, 1.01	kJ/(kgK)
c_v	Specific heat at constant volume, 0.718	kJ/(kgK)
R_g	Specific gas constant, $c_p - c_v$	kJ/(kgK)
γ	Specific heat ratio, c_p/c_v	–

to capture the impacts of heat transfer on engine behaviour. The mechanical efficiency η_m is introduced to quantify the bearing power losses on turbine shaft and windage losses in the EM. Strong nonlinearities exist in the air system for the mass flow exchanges among the EGR, turbine, compressor, and manifolds, together with the powers generated by the turbine and consumed by the compressor. The mass flow rates and powers can be expressed in implicit forms:

$$\begin{aligned} W_{egr} &= f(p_{in}, p_{exh}, \chi_{egr}), & W_e &= f(p_{in}, T_{in}, \eta_v, N), \\ W_t &= f(p_{exh}, T_{exh}, \chi_{vgt}), & W_c &= f(p_{in}, \omega), \\ P_t &= f(W_t, T_{exh}, p_{exh}, \eta_t), & P_c &= f(W_c, p_{in}, \eta_c). \end{aligned}$$

The EGR loop mass flow rate is modeled as the standard orifice equation, while the engine total mass flow rate is modeled by the speed-density equation [37]. Turbine mass flow rate and air mass flow rate are modeled as nonlinear functions with respect to the efficiency η_t and η_c , which are generated by steady state characterisation maps provided by the turbocharger supplier.

In the proposed research, a switched reluctance motor (SRM) is employed as the ETA since there is no winding on the rotor. The simple structure grants the SRM high rotor temperature capability. The SRM has no concern about the high cost of rare-earth materials.

4. System Characterisation

The system characterisation will analyse the impacts of ETA on fuel economy and air system variables, to underpin the selection of critical control variables.

4.1. Analysis of ETA on Fuel Economy

Table 2: Settings on the actuator actions in calibration tests

Settings	Actuators		
	χ_{vgt}	P_{em}	χ_{egr}
Minimum value	0.1	-5 kW	0
Maximum value	0.5	5 kW	0.3
Step	0.1	2.5 kW	0.1

The engine brake specific fuel consumption would decline when ETA runs in the motoring mode and would increase when ETA runs in the generating mode. To

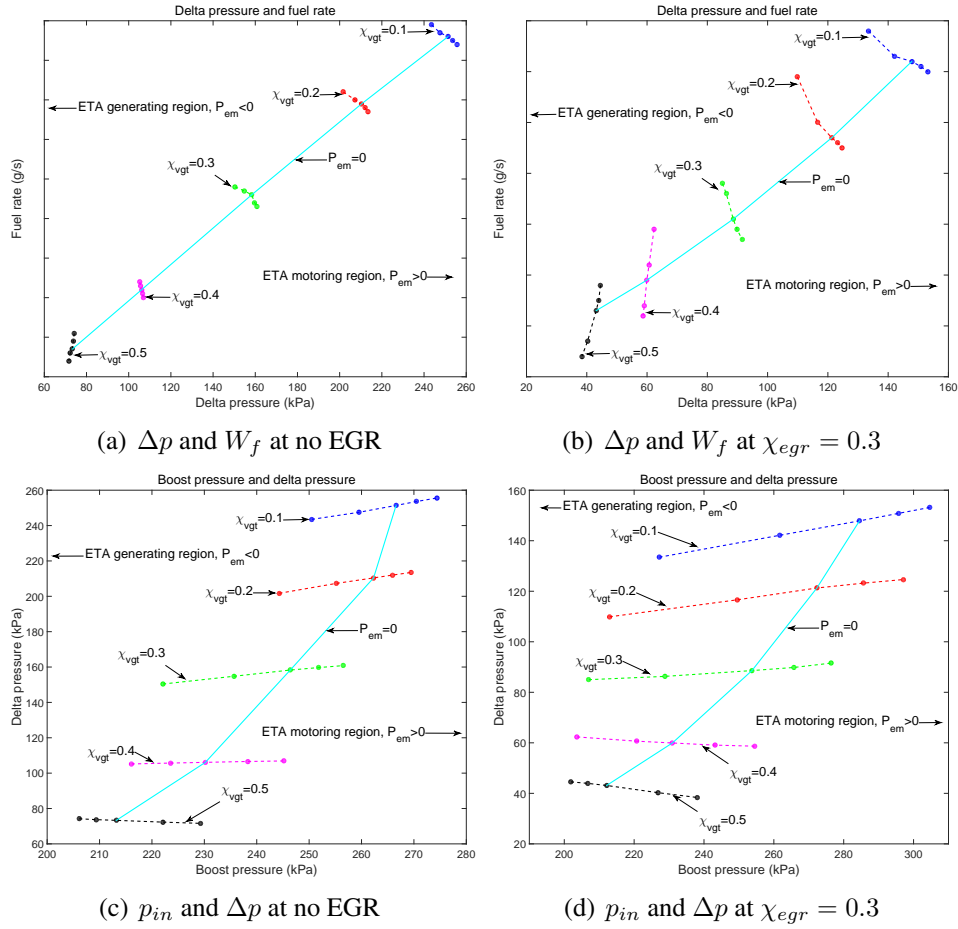


Figure 3: Relation between Δp , fuel rate, and boost pressure

analyse the impact of ETA on the engine fuel economy, a group of calibration tests have been made on a 7.01-Litre heavy-duty ETDE at 1800 rpm at approximately 60% load. The actuator actions are kept as constants in a single test, and their settings are shown in Table 2. Two groups of calibration at $\chi_{egr} = 0$ and $\chi_{egr} = 0.3$ are elaborated for illustration.

In both Fig. 3(a) and Fig. 3(b), when χ_{vgt} and χ_{egr} are fixed, the fuel rate declines when P_{em} increases, indicating the fuel efficiency improves because of the ETA motoring. In the ETA motoring mode, the air-fuel-ratio is increased with no requirement for more turbine power, which leads to a reduction on engine pumping losses and therefore, the fuel efficiency is improved. When χ_{vgt} closes

from 0.5 to 0.1 with fixed P_{em} and χ_{egr} , more penalties on pumping efficiency and mechanical efficiency are suffered. As a result, the fuel efficiency is reduced. In the process of χ_{vgt} closing, the turbine shaft spins faster and therefore more fresh air is boosted into the engine. To keep a fair air-fuel-ratio, more fuel is required to be burned. As a consequence, the fuel rate increases. Similar phenomena can be observed when χ_{egr} varies with fixed χ_{vgt} and P_{em} . When χ_{egr} increases, more exhaust gas is recirculated into the intake manifold and reduces the amount of air. Accordingly, the fuel rate reduces to keep a reasonable air-fuel-ratio.

The difference between the boost pressure and exhaust pressure is defined as

$$\Delta p = p_{exh} - p_{in}. \quad (6)$$

The impact of the actuator actions can be revealed by the variations on Δp . At a specified boost pressure level, the fuel rate is determined by the Δp value. Since the setpoint of p_{in} is normally generated by the engine control unit (ECU), the fuel rate of an ETDE can be regulated in closed-loop control by tuning the setpoint of Δp .

Fig. 3(c) and Fig. 3(d) illustrate the relation between Δp , p_{in} and actuator actions. As χ_{vgt} closes from 0.5 to 0.1 with fixed P_{em} , both p_{in} and p_{exh} increase, as well as the condition when P_{em} increases with the fixed χ_{vgt} . When ETA switches from the generating mode to the motoring mode, Δp increases slightly at low χ_{vgt} opening (towards close), and drops slightly at high χ_{vgt} opening (towards open). This phenomenon is because the expansion ratio of the turbine varies with different χ_{vgt} values.

4.2. Analysis of ETA on Air System Variables

The key to reducing exhaust emissions in terms of NO_x and particulate matters (PM) is keeping rational values of air-fuel ratio and EGR fraction, which can be obtained from the independent variables W_c and W_{egr} . Equally, the independent variables can also be replaced by p_{in} and W_{egr} . However, due to the introduction of ETA in the ETDE, controlling only p_{in} and W_{egr} is not enough. A further performance variable in the exhaust manifold has to be considered. In the available literature, explicit principles for selecting control variables of an ETDE have not been found.

Fig. 4(a) and Fig. 4(b) show the strong coupling between p_{in} and ω in the setting of $\chi_{egr} = 0$ and $\chi_{egr} = 0.3$, respectively. In both conditions, ω behaves as a polynomial function with p_{in} . The causality logics can be explained by physics. The enthalpy in the exhaust gas speeds up the turbocharger, which is a slow process. The rotational motion of the compressor blades then transfers this kinetic

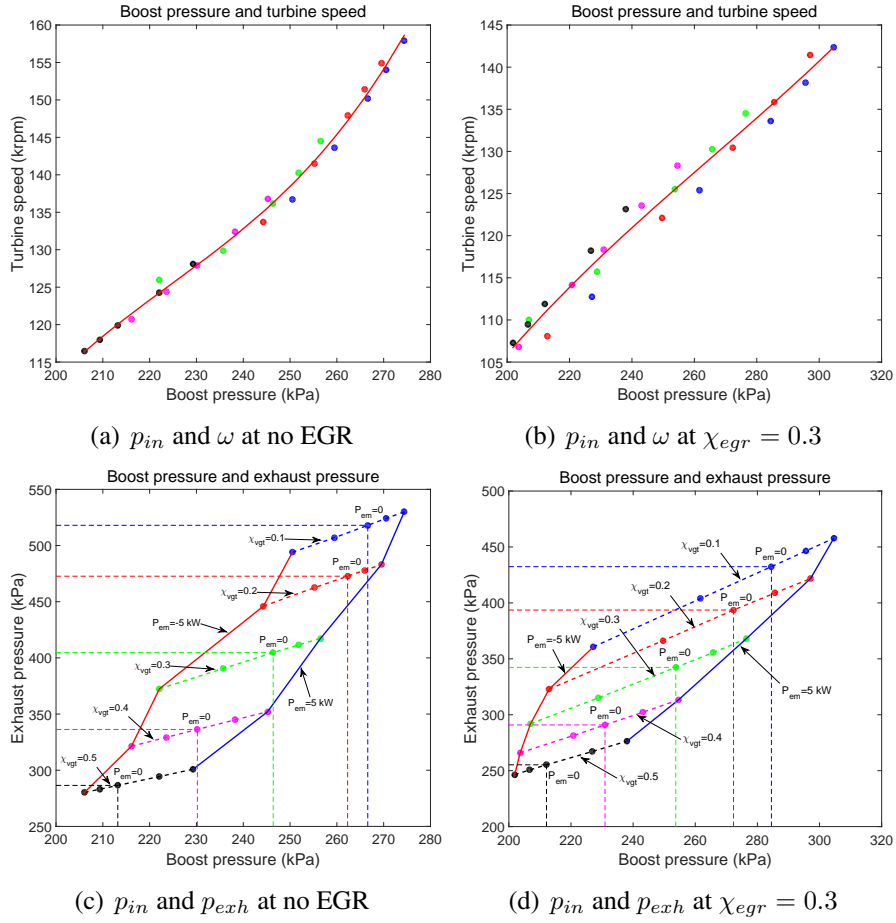


Figure 4: Relation between boost pressure, turbine speed, and exhaust pressure

energy to the fresh air, which is a fast process. These relations explain why there is an almost linear relation between p_{in} and ω . As a comparison, Fig. 4(c) and Fig. 4(d) show p_{exh} varies considerably according to different settings on both χ_{vgt} and P_{em} , which offers significant flexibility. Based on the analysis on the fuel economy and air system couplings, the control variables are selected as

$$y = [p_{in}, p_{exh}, W_{egr}]^T, \quad (7)$$

with the control inputs of

$$u = [\chi_{vgt}, P_{em}, \chi_{egr}]^T. \quad (8)$$

By properly regulating each element of y , engine efficiency can be maximized in the specified layout, together with a fast response in transients.

5. Low Level Controller Design

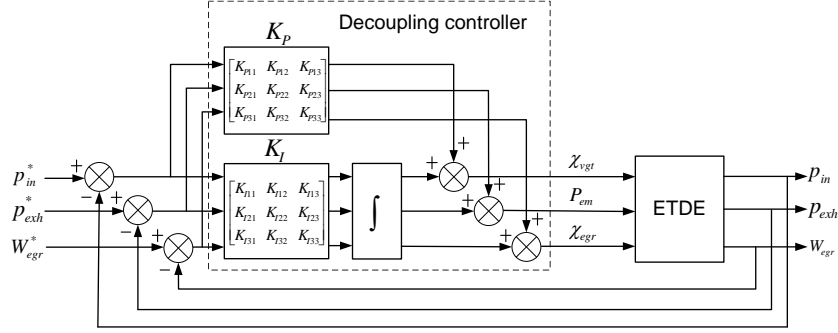


Figure 5: The diagram of ETDE air system control

Distributed proportional-integral (PI) controllers are commonly used in the conventional turbocharged diesel engines in industrial cases. The control variables are normally p_{in} and W_{egr} with the control inputs of χ_{vgt} and χ_{egr} . However, the new layout of the ETDE changes the dynamics significantly. Therefore the gain values of the PI controllers require to be re-designed in the 3I3O structure. Since it is time consuming to tune the PI gain values individually, designing a centralized MIMO controller would greatly reduce the calibration effort. Moreover, consideration of the internal couplings will improve the tracking performance. The low level 3I3O control diagram is illustrated in Fig. 5, in the form of a 3I3O PI controller, whose control gains K_{Pij} and K_{Iij} ($i = 1, 2, 3, j = 1, 2, 3$) are to be tuned by the H_∞ method; p_{in}^* , p_{exh}^* , and W_{egr}^* are the setpoints of p_{in} , p_{exh} , and W_{egr} , respectively.

5.1. Control Problem Formulation

At a specified operating point, the ETDE air system model can be expressed as:

$$\begin{cases} x(k+1) = Ax(k) + Bu(k) \\ y(k) = Cx(k) \end{cases}, \quad (9)$$

where $x \in \mathbb{R}^n$, $u \in \mathbb{R}^3$, and $y \in \mathbb{R}^3$ are the state vector, input vector, and output vector, respectively; A , B , and C are coefficient matrices to be identified from

the time domain data. Considering external disturbances in modelling, the ETDE model can be augmented as:

$$\begin{bmatrix} x(k+1) \\ z(k) \\ y(k) \end{bmatrix} = \begin{bmatrix} A & B_1 & B_2 \\ C_1 & D_{11} & D_{12} \\ C_2 & D_{21} & D_{22} \end{bmatrix} \begin{bmatrix} x(k) \\ w(k) \\ u(k) \end{bmatrix}, \quad (10)$$

where $w \in \mathbb{R}^{m_1}$ is the vector of exogenous inputs, $z \in \mathbb{R}^{p_1}$ is the vector of regulated outputs. In the proposed ETDE control problem, w includes fuel rate, desired speed and load, and other regulating variables, whilst z includes pressures, temperatures, flow rates, and the output signals.

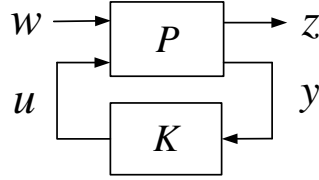


Figure 6: Low level controller block diagram

The full-order controller block diagram and the control implementation structure of the ETDE are illustrated in Fig. 6, while P and K are the controlled plant and the dynamic output feedback control gain matrix to be designed.

A H_∞ controller $u = Ky$ addressing the following optimisation problem is to be built:

$$\begin{aligned} \underset{g}{\text{minimize}} : & \max_i \{ \|T_{w_i \rightarrow z_i}(P, K)\| \}, \\ \text{subject to} : & \max_j \{ \|T_{w_j \rightarrow z_j}(P, K)\| \} \leq 1, \end{aligned} \quad (11)$$

where g denotes the vector of manipulated parameters, $\|T_{w \rightarrow z}\|$ denotes the closed loop relationship from w to z , and $\|\cdot\|$ is either the H_∞ norm or the H_2 norm, i and j are the index of soft (nice to have) objectives and hard (must have) constraints, respectively. The optimisation problem (11) means minimization of the worst-case value of the soft objectives while satisfying all the hard constraints. All the terms are normalized in the formulation.

5.2. Model Identification

The general procedure of model identification is shown in Fig. 7. Applying the perturbation signals of $u(t)$ on the physical ETDE model, the generated $y(t)$

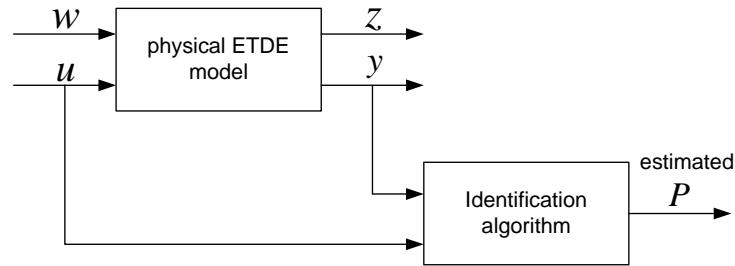


Figure 7: Model identification diagram

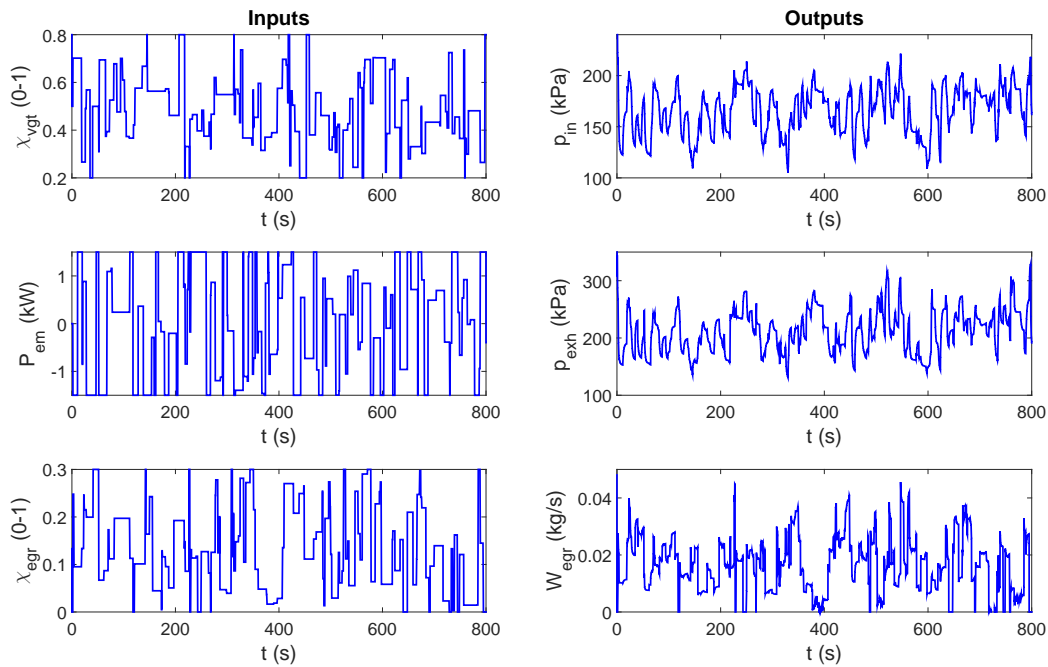


Figure 8: Calibration for model identification

is measured and recorded. The calibration data $u(t)$ and $y(t)$ are categorized into training data and validation data. A group of candidate state space models with different orders would be identified from the training data. Afterwards, $u(t)$ in the validation data is applied on the candidate models to produce predicted outputs. By comparing the real outputs and predicted outputs, the model with the best fitting results will be selected as the proper model.

As an example, the calibration data on the `Dynasty` model at the operating point of 1800 rpm and 260 Nm is illustrated in Fig. 8. The calibration has contin-

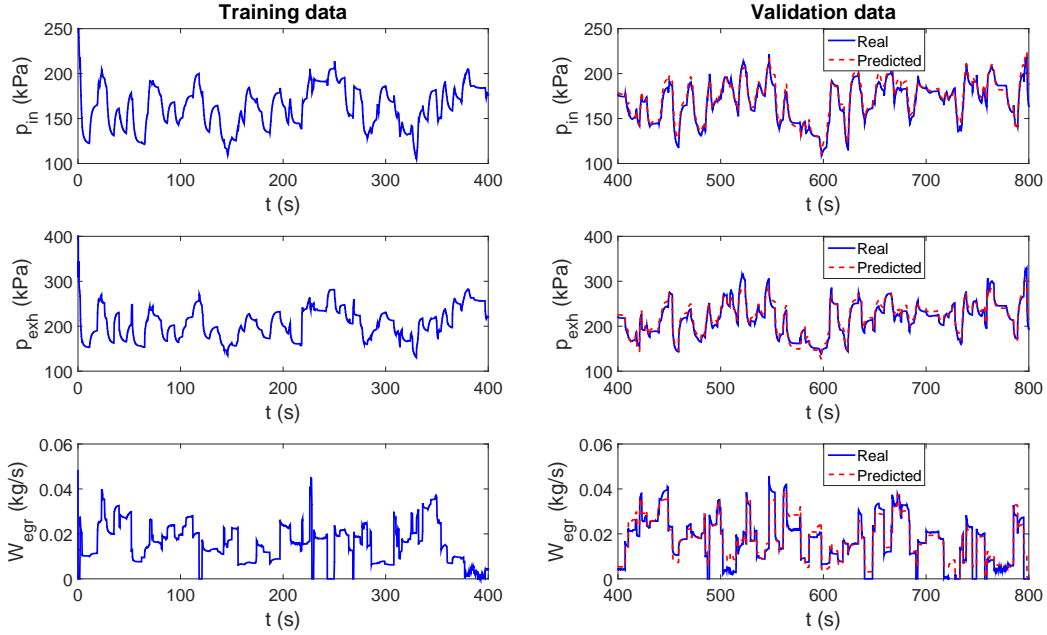


Figure 9: Training and validation in model identification

ued for 800 seconds, while the action ranges of χ_{vgt} , P_{em} , and χ_{egr} are limited as $[0.2, 0.8]$, $[-1.5 \text{ kW}, 1.5 \text{ kW}]$, and $[0, 0.3]$, respectively. The generated first half 400 seconds data are used for training and the latter half 400 seconds data are used for validation.

The normalized root-mean-square deviation (NRMSD) value is introduced to quantify the difference between the predicted values and measured values, which is expressed as a percentage. For the i^{th} variable in y , the NRMSD value is defined as

$$F(i) = 1 - \frac{\sqrt{\sum_{j=1}^m (y_v(i, j) - y_p(i, j))^2}}{\sqrt{\sum_{j=1}^m (y_v(i, j) - \bar{y}_v(i))^2}}, \quad i = 1, 2, 3, \quad (12)$$

where y_v is the validation data, y_p is the predicted data, $\bar{y}_v(i)$ is the mean value of $y_v(i)$:

$$\bar{y}_v(i) = \sum_{j=1}^m y_v(i, j) / m, \quad i = 1, 2, 3, \quad (13)$$

Table 3: Performance indices in low level controller design

Performance indices		Operating point	
		A	B
Soft objectives	Settling time (s)	1	0.1
	Steady state error (%)	0.5	0.1
Hard constraints	Gain margin (dB)	7	7
	Phase margin (degree)	45	45

and m is the number of validation data samples.

By comparing the $F(i)$, a third-order model with the highest value is selected as the proper model at the specified operating point. The model validation results are illustrated in Fig. 9, while the NRMSD values on p_{in} , p_{exh} , and W_{egr} are 85%, 83%, and 75%, respectively. The identified coefficient matrices are as follows:

$$A = \begin{bmatrix} 0.7894 & -0.8801 & 0.2418 \\ 0.0507 & 0.7156 & 0.0578 \\ 0.1415 & -1.1459 & 1.2426 \end{bmatrix},$$

$$B = \begin{bmatrix} -0.2660 & -0.0000 & 0.3055 \\ 0.7990 & 0.0028 & -0.1764 \\ 2.7721 & 0.0104 & -0.5716 \end{bmatrix},$$

$$C = \begin{bmatrix} -12.1863 & -576.9938 & 165.1306 \\ -99.0510 & -1084.0446 & 298.8131 \\ 0.0732 & 0.3462 & -0.0931 \end{bmatrix}.$$

5.3. Controller Synthesis

A nonsmooth H_∞ synthesis method is employed to tune the controller gain values since it excels in handling internal couplings [38]. A mixed set of frequency- and time- domain indices can be addressed by the nonsmooth H_∞ synthesis method.

In the trenching test cycle which is typical for heavy-duty engines, the engine speed is fixed at 1800 rpm, while the load changes mainly between 200 Nm and 800 Nm. Therefore, two operating points, (1800 rpm, 260 Nm), and (1800 rpm, 700 Nm), are chosen as the operating points for testing to reveal the frequent usage in practice. In generating the decoupling control law, the performance indices are to be specified. The soft objectives are chosen as the steady state error and the settling time. The hard constraints are chosen as the stability margins including the phase margin and the gain margin. The performance indices at the two specified operating points are shown in Table 3, where A and B denote the low load

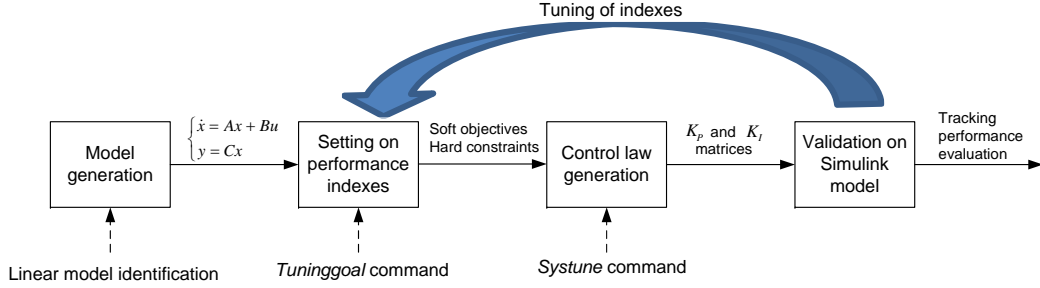


Figure 10: Workflow in developing low level controller

point and the high load point, respectively. From the engineering point of view, the workflow in designing the low level controller is illustrated as Fig. 10, where the `systune` solver in Matlab is used to generate the control law, and the performance indices are set by the `Tuninggoal` command [39]. The control gain matrices of the low level controller are computed as

$$K_P = \begin{bmatrix} -0.0047 & -0.0003 & -0.1643 \\ 0.0055 & -0.0002 & 0.1691 \\ 0.0043 & -0.0001 & 1.7834 \end{bmatrix}, K_I = \begin{bmatrix} 0.0010 & -0.0298 & -0.0522 \\ 0.1250 & -0.0002 & -8.3433 \\ -0.0001 & -0.0158 & 13.0723 \end{bmatrix}.$$

at (1800 rpm, 260Nm), and

$$K_P = \begin{bmatrix} -0.0104 & 0.0007 & -0.8525 \\ 0.0087 & -0.0013 & 1.3314 \\ -0.0009 & -0.0002 & 0.3255 \end{bmatrix}, K_I = \begin{bmatrix} -0.0248 & -0.0084 & -4.5212 \\ 0.2297 & -0.0764 & -1.0750 \\ 0.0056 & -0.0005 & 22.5241 \end{bmatrix}$$

at (1800 rpm, 700Nm).

At point A, p_{in}^* and W_{egr}^* are fixed as 170 kPa and 0.03 kg/s, respectively, while p_{exh}^* changes as a series of step-changed values between 180 kPa and 260 kPa. The incremental pace on p_{exh}^* is set as 10 kPa every 15 seconds. The results in Fig. 11 show that the tracking of all three variables are very desirable. χ_{vgt} and χ_{egr} both move toward to close when p_{exh}^* increases. At the meantime, the ETA is generating more power to stabilize p_{in} and W_{egr} . To observe the dynamics more clearly, the magnified tracking performance and actuator actions in a shorten period with just one step change on p_{exh}^* is shown in Fig. 12. All the control variables are attracted to the desired trajectories fast despite the step change on p_{exh}^* , and only minor overshooting is introduced.

Similarly, the simulation results at point B are shown as Fig. 13. p_{in}^* and W_{egr}^* are set as 240 kPa and 0.05 kg/s, respectively, while p_{exh}^* changes as a series of

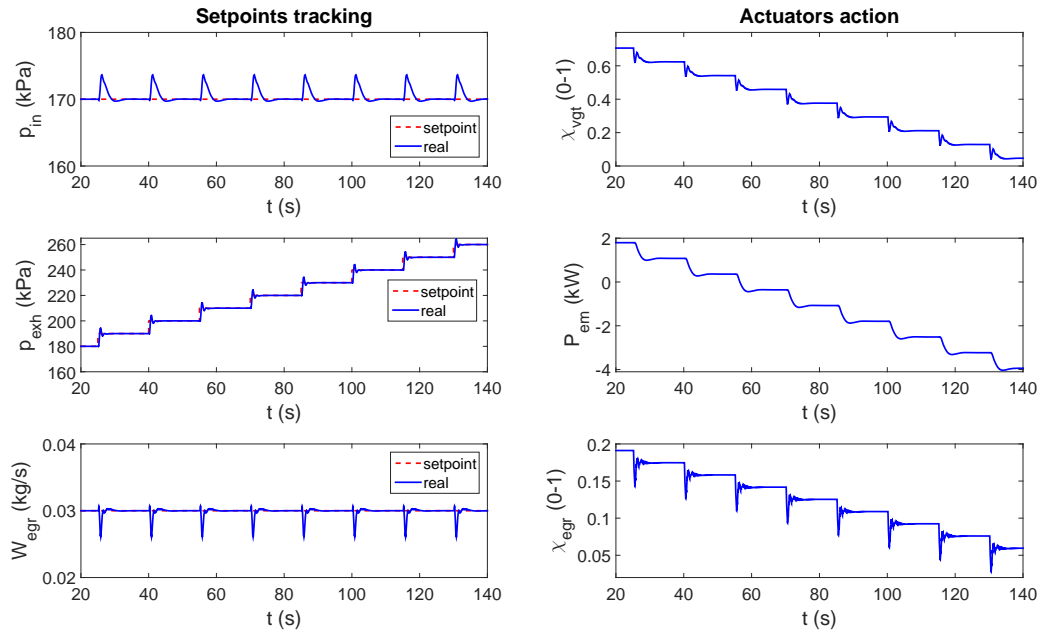


Figure 11: Mathematical simulation results at 1800 rpm, 260Nm

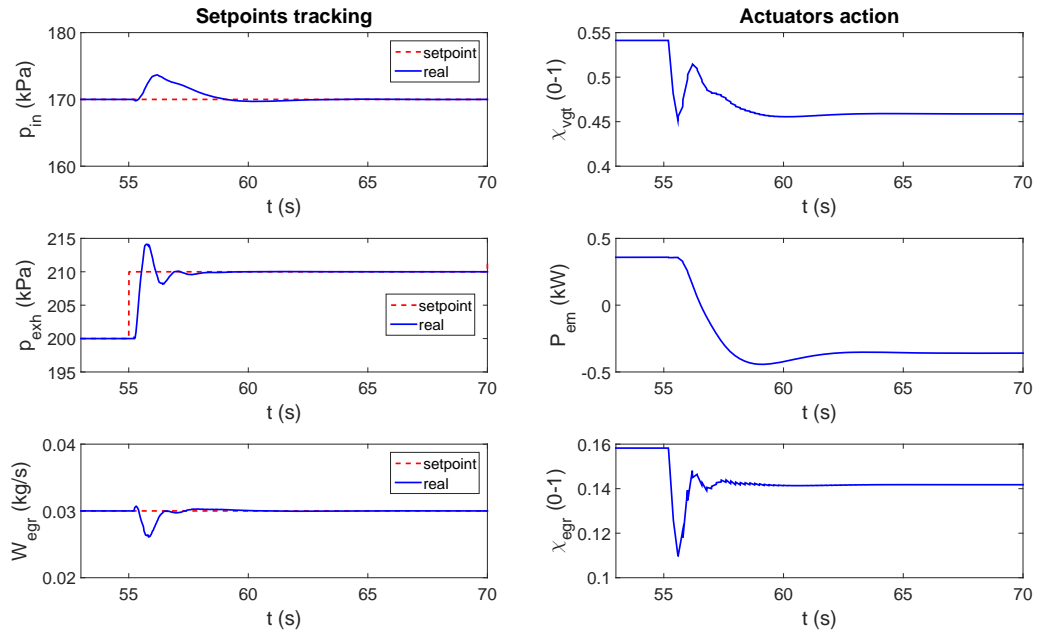


Figure 12: Control behaviour of using the low level controller at 1800 rpm, 260 Nm with step change on p_{exh}^* in Simulink

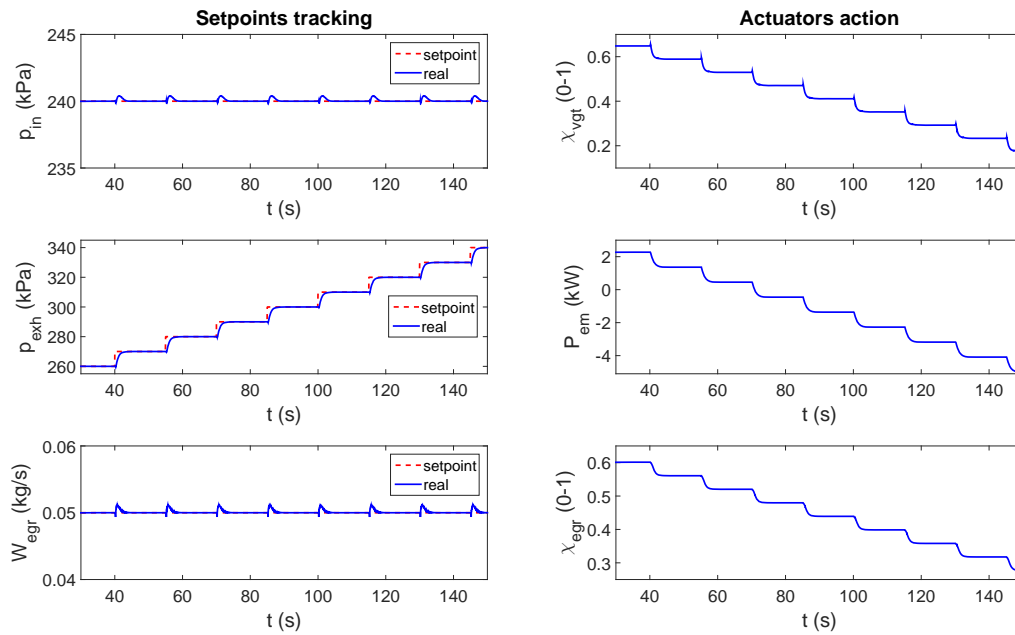


Figure 13: Mathematical simulation results at 1800 rpm, 700Nm

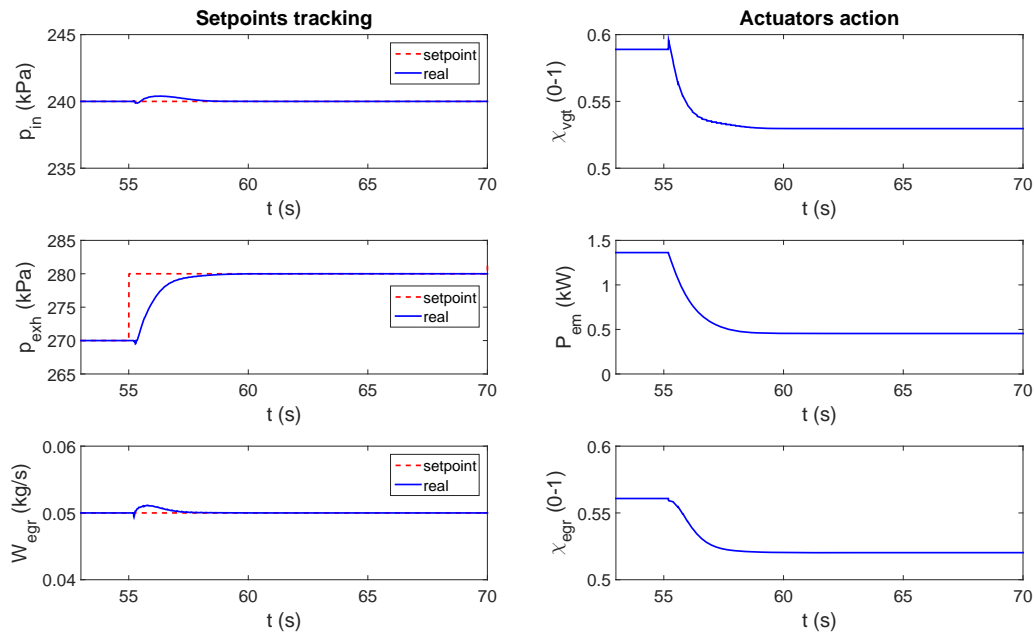


Figure 14: Control behaviour of using the low level controller at 1800 rpm, 700 Nm with step change on P_{exh}^* in Simulink

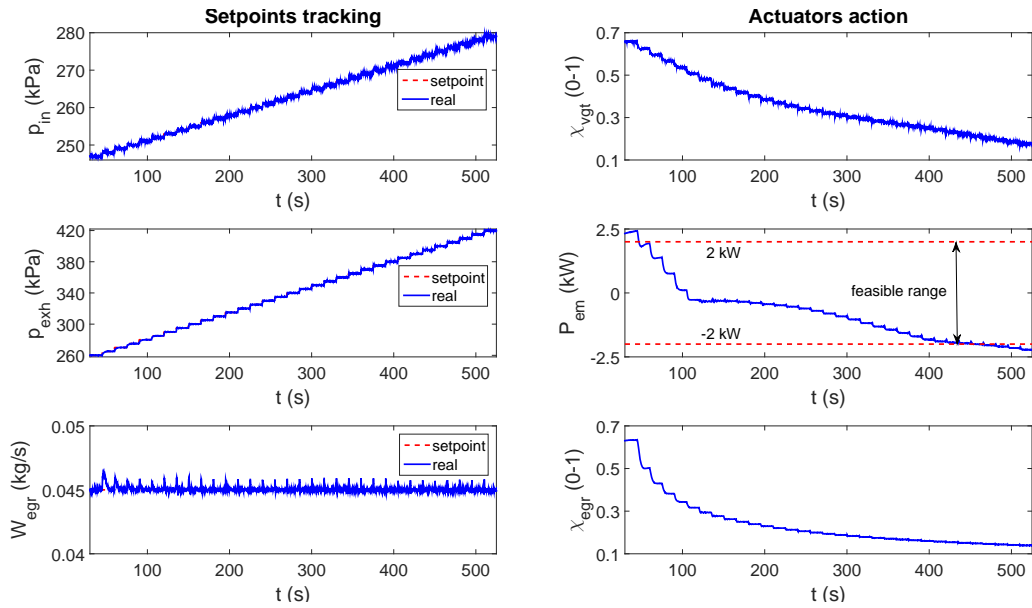


Figure 15: Calibration for the boundaries of p_{exh}^* at 1800 rpm, 700 Nm

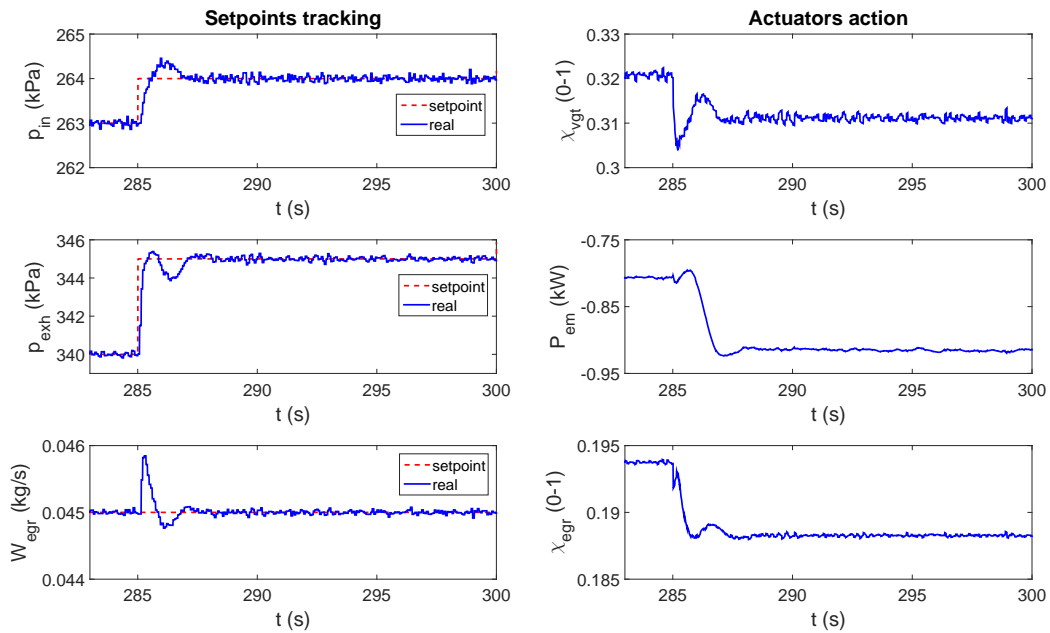


Figure 16: Control behaviour of using the low level controller at 1800 rpm, 700 Nm with step changes on p_{in}^* and p_{exh}^* in

Dynasty

Table 4: Lookup table of P_a and P_{em} with respect to p_{exh}^*

p_{exh}^* (kPa)	P_a (kW)	P_{em} (kW)
265	351.26	1.94
275	353.25	0.76
285	355.17	-0.27
295	356.95	-0.31
305	358.65	-0.34
315	360.36	-0.44
325	362	-0.54
335	363.63	-0.7
345	365.27	-0.92
355	366.9	-1.18
365	368.54	-1.44
375	370.11	-1.7
385	371.74	-1.89
395	373.38	-1.97

step-changed values between 260 kPa and 340 kPa. The incremental pace on p_{exh}^* is also set as 10 kPa every 15 seconds. The zoomed in results are illustrated in Fig. 14 for better observation. The tracking performance is still very fast and accurate.

6. Supervisory Level Controller Design

The supervisory level controller is designed to find the optimal value of y^* in real-time for energy management. Prior to the online implementation, an offline calibration on the boundaries of y^* is required to guarantee y^* are reachable.

6.1. Generation of Setpoints

In industrial cases, the values of p_{in}^* and W_{egr}^* are obtained from the engine calibration settings within the ECU. Therefore, only p_{exh}^* is to be determined. A calibration-based approach is implemented to get the boundary values of p_{exh}^* . In the calibration, p_{exh}^* is set as an incrementally increasing series. The developed low level controller is applied on the `Dynasty` ETDE model to track p_{exh}^* . The value of p_{exh}^* is feasible only if it can be tracked well in the allowed ranges of actuator actions. If the actuator actions violate the allowed ranges in some cases, it implies the p_{exh}^* value is beyond its boundary.

Fig. 15 shows the calibration of the boundary of p_{exh}^* at 1800 rpm, 700 Nm, while p_{exh}^* increases from 260 kPa to 420 kPa stepwise, with the incremental pace of 5 kPa every 15 seconds. The p_{in}^* is set as the mean value of the ECU-generated setpoints at each p_{exh}^* step. Since W_{egr}^* changes very slowly, it is fixed as 0.045 kg/s. It can be observed that all the given p_{exh}^* values are tracked well. In this case, the action ranges of χ_{vgt} , P_{em} , and χ_{egr} are limited as [0.1, 0.9], [-2 kW, 2 kW], and [0, 1], which are indicated in the right column of Fig. 15. As observed, the feasible p_{exh}^* is located in the band of [265 kPa, 395 kPa]. Similarly, the boundaries of p_{exh}^* at other operating points are also determined in the same way. At the other untested operating points, the boundaries are obtained by means of gain scheduling. Selected fuel power and EM power in Fig. 15 are listed in Table 4. When the EM running in the generating mode, its power changes more gently compared with the motoring mode, as shown in Table 4. This is because when the EM is running in the motoring mode and the generating mode, the power is obtained from

$$P_{em} = T_{em}\omega_{em}/\eta(T_{em}, \omega_{em}) , \quad (14)$$

and

$$P_{em} = \eta(T_{em}, \omega_{em})T_{em}\omega_{em}, \quad (15)$$

respectively, where T_{em} and ω_{em} are the EM torque and speed, respectively; $\eta(T_{em}, \omega_{em})$ is the EM efficiency regarding to T_{em} and ω_{em} . Therefore, less power can be generated under the same condition because of power losses.

6.2. Optimisation of Setpoints

The supervisory level controller realizes the optimisation problem in real-time by minimizing an instantaneous cost function. The energy equivalent factor in (2) is designed as

$$s = K_P \Delta SOC, \quad (16)$$

where K_P is a positive constant, and

$$\Delta SOC = SOC - SOC^*, \quad (17)$$

while SOC^* is the desired value of battery SOC.

Without considering electrical energy losses, it is assumed that P_{em} is equal to P_b . At different battery SOC values, P_a and P_b have different weights in the cost function P_{eq} . The optimal p_{exh}^* is obtained from the lookup table that corresponds to the minimal P_{eq} as in Table 4.

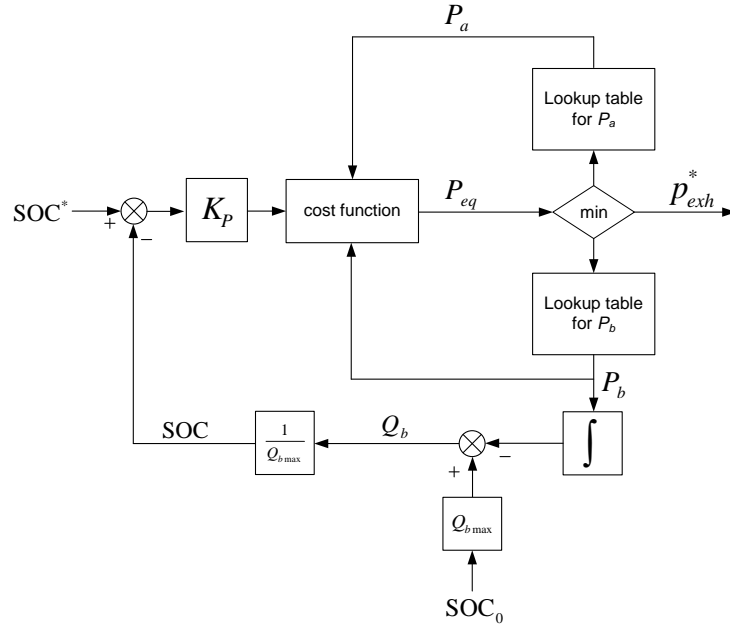


Figure 17: The diagram of supervisory level controller

The diagram of the supervisory level controller is illustrated in Fig. 17, where Q_b and $Q_{b\max}$ denote the battery stored energy and battery capacity, respectively. At the supervisory level controller, p_{exh}^* is generated according to the minimized P_{eq} , whose value is computed by the feedback variables P_a and P_b , and s . The generated p_{exh}^* , together with p_{in}^* and W_{egr}^* from the ECU are the setpoints to be tracked. They are sent to the cascaded low level controller.

7. Physical Simulation Results

The controllers are built in Matlab/Simulink. For the synchronisation of actions, the sampling frequency of the engine model in `Dynasty` and the controller in Simulink are both set as 100 Hz. The operating points are also selected as (1800 rpm, 260 Nm), and (1800 rpm, 700Nm), identical to those in controller synthesis. A block load condition on the switching between the two operating points is also given, while the gain values are scheduled. The values of p_{in}^* and W_{egr}^* are generated in real-time from the embedded setpoint maps in the ECU.

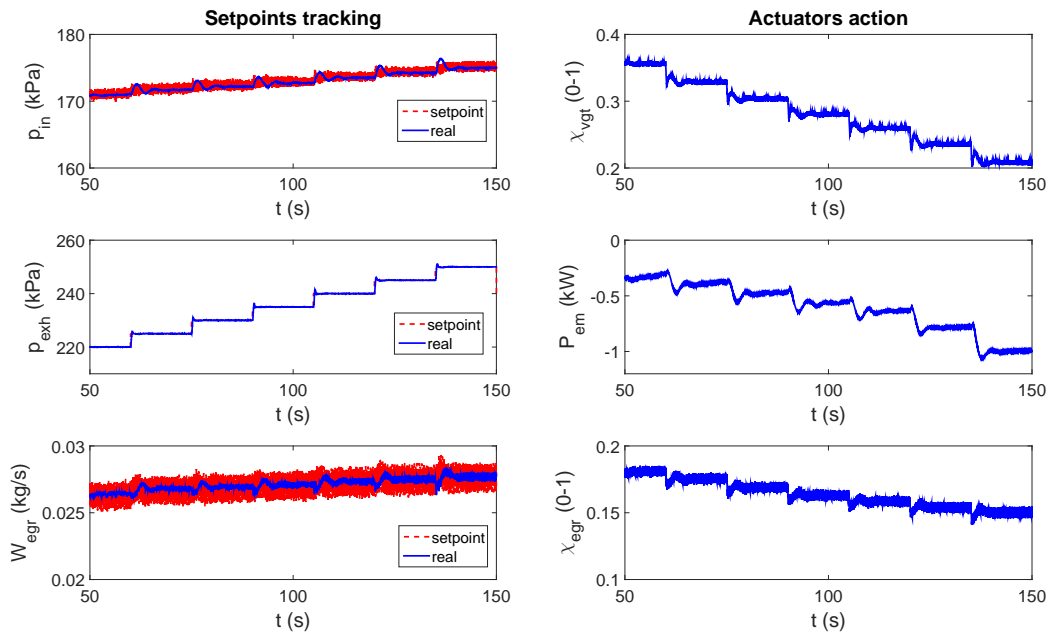


Figure 18: Physical simulation results at 1800 rpm, 260Nm

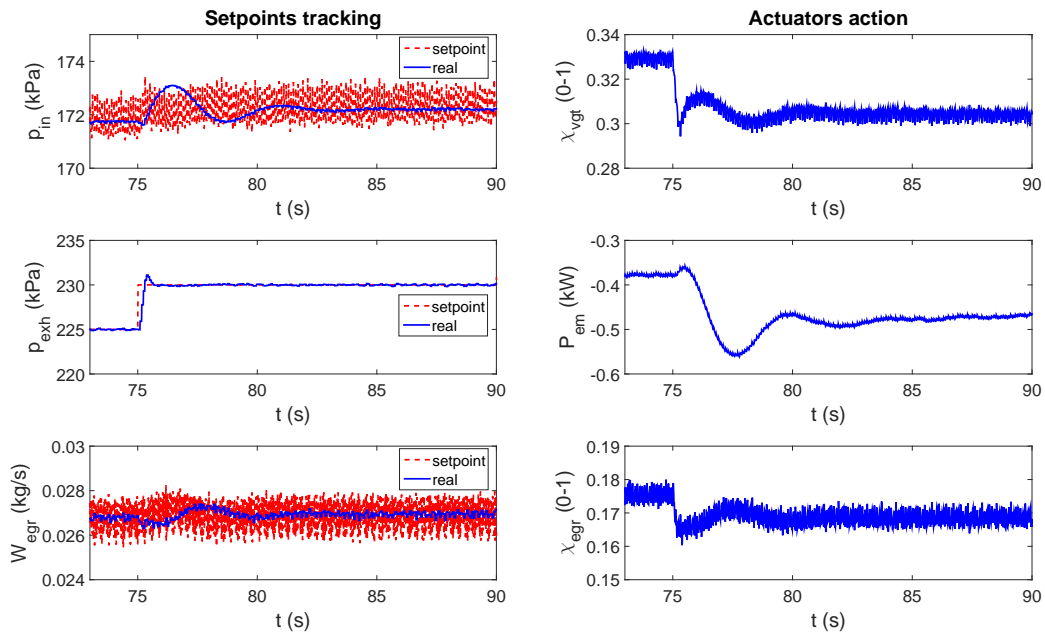


Figure 19: Control behaviour of using the low level controller at 1800 rpm, 260 Nm with step change on p_{exh}^* in

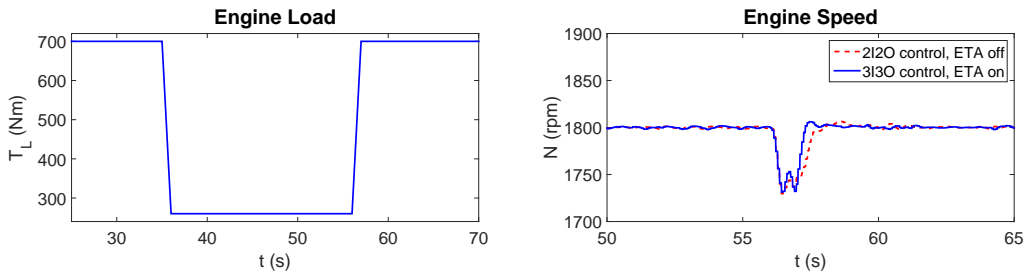


Figure 20: Operating condition at block loads in low level controller test

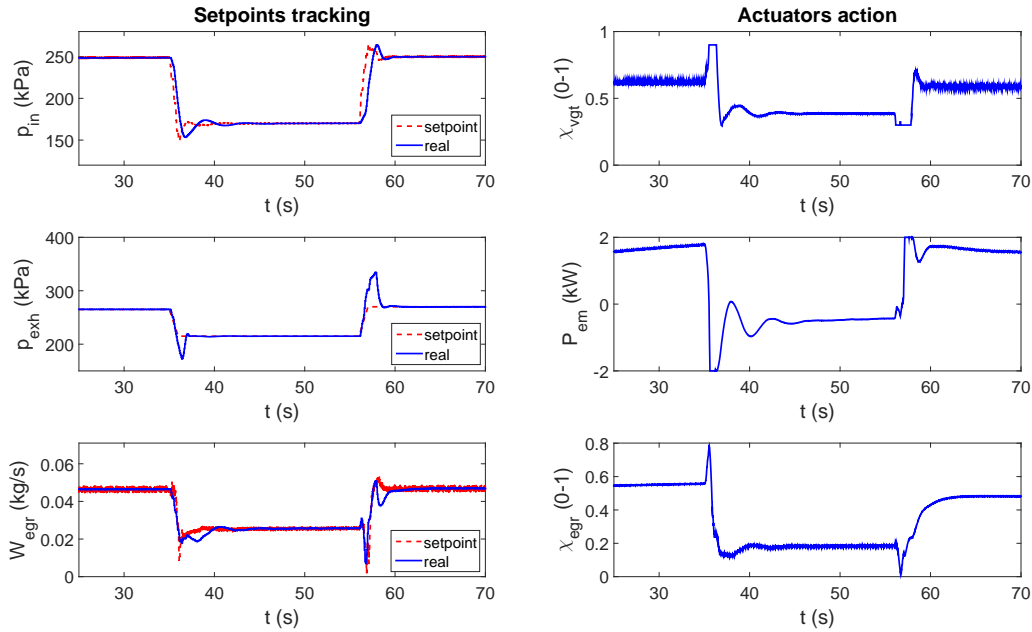


Figure 21: Control behaviour at block loads using low level controller

7.1. Evaluation of the Low Level Controller

The tracking performance of using the low level controller at steady states and transients are both evaluated.

7.1.1. Tracking Evaluation at Steady States

The simulation results at (1800 rpm, 260 Nm) are illustrated in Fig. 18. The p_{exh}^* changes as a series of step-changed values between 220 kPa and 250 kPa. The incremental pace on p_{exh}^* is set as 5 kPa every 15 seconds. Since P_{em} is reduced to

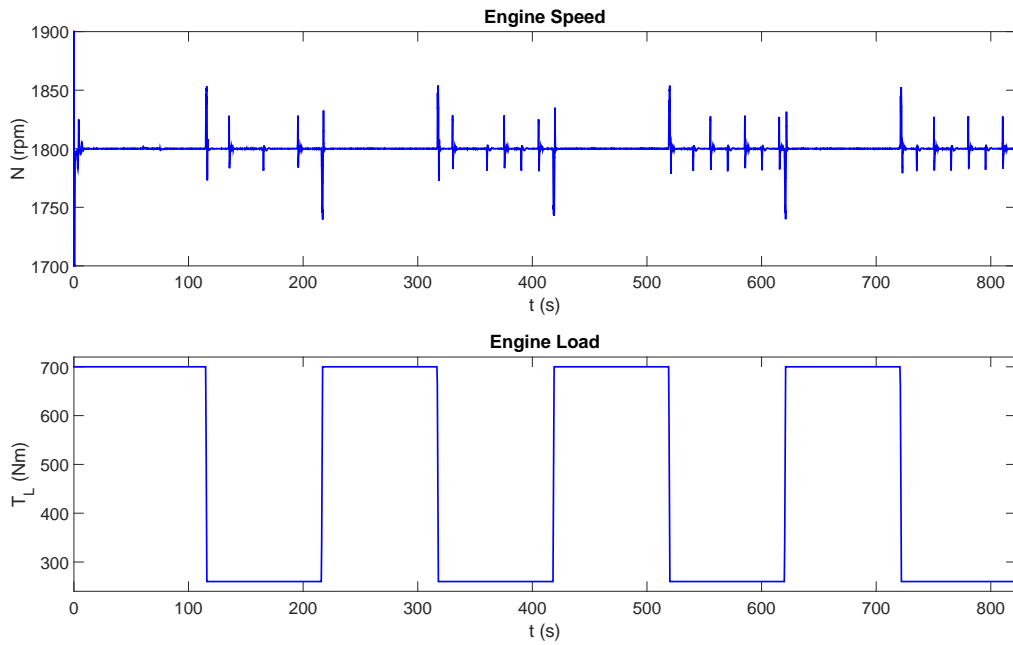


Figure 22: Operating condition in two-level energy management strategy test

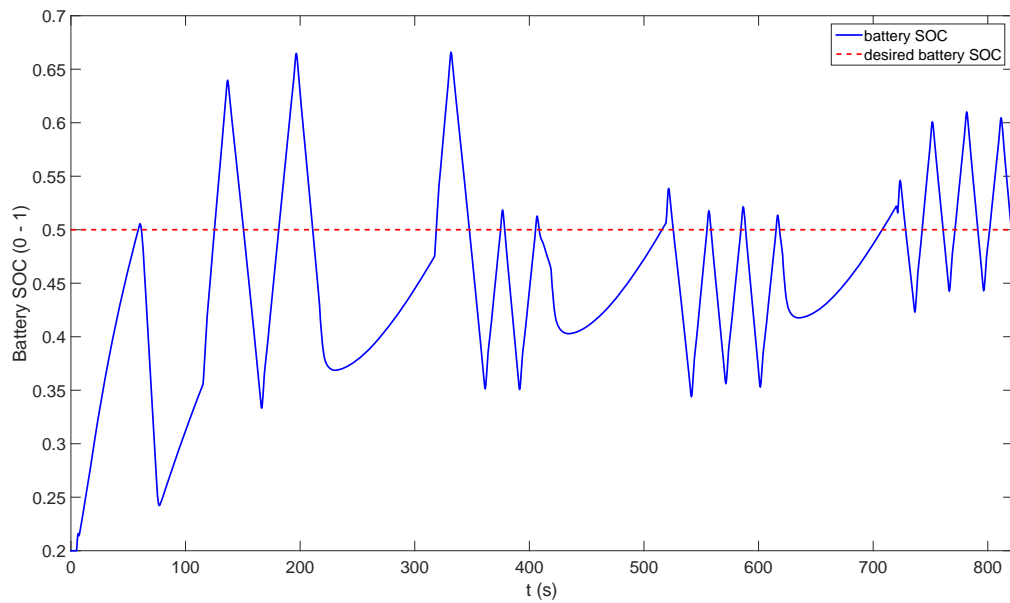


Figure 23: Battery SOC variance with SOC initial value of 20%

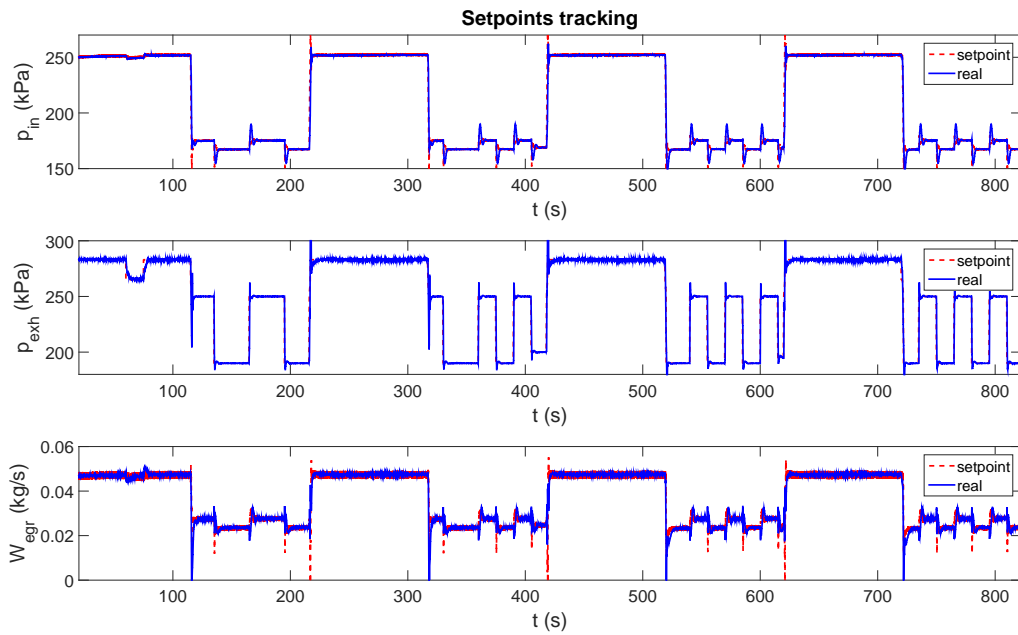


Figure 24: Tracking performance in two-level energy management test

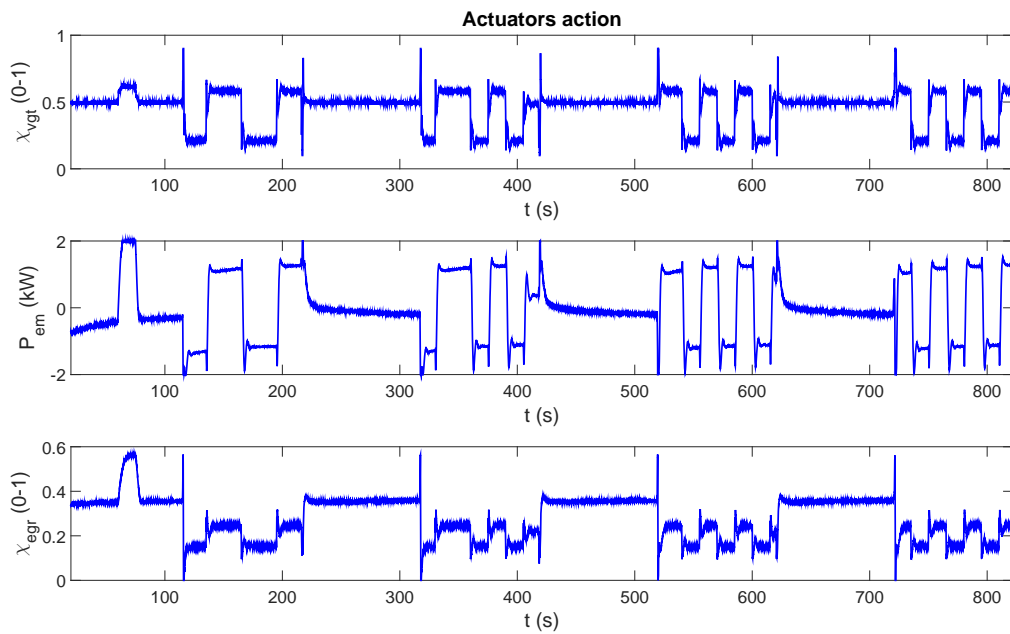


Figure 25: Actuator actions in two-level energy management test

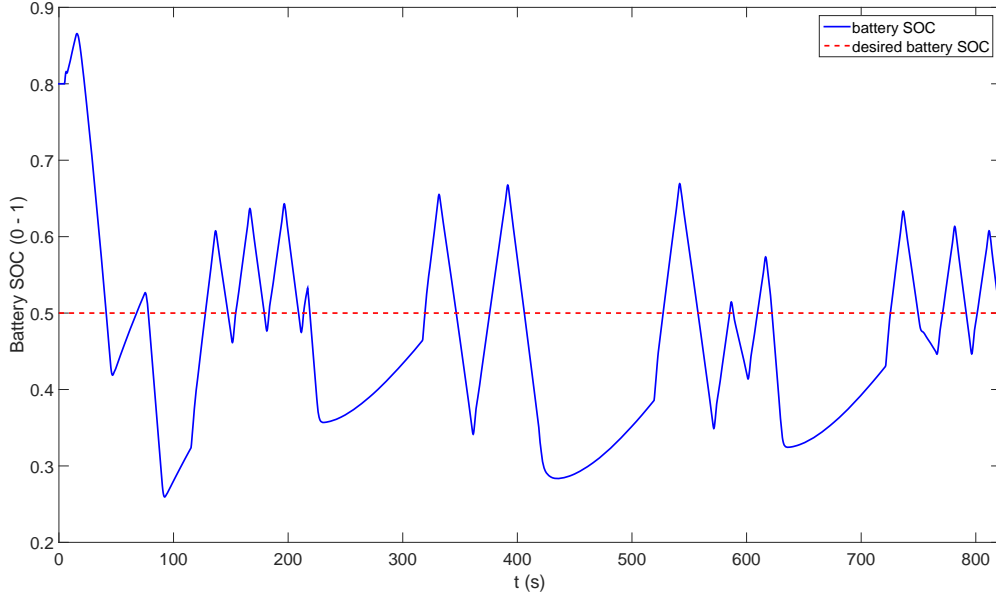


Figure 26: Battery SOC variance with SOC initial value of 80%

lift p_{exh} , the fuel rate is increasing correspondingly. Because the embedded maps are computed from oxygen-fuel-ratio maps, the required oxygen is also increasing. Therefore, p_{in}^* and W_{egr}^* increase slightly to meet the requirements on more fresh air delivery. At the same time, χ_{vgt} moves toward close to promote p_{exh} . As a result, χ_{egr} decreases to compensate the increasing tendency of W_{egr} . The magnified results are presented in Fig. 19 to observe the tracking performances and actuator actions more clearly. The centralized decoupling controller guarantees that all the three performance variables are tracked fast and accurately, with very short settling time and minor overshooting.

The simulation results at 1800 rpm, 700 Nm have been shown in Fig. 15 and Fig. 16 in the supervisory level controller design section. In both testing conditions, the tracking performances are very desirable.

7.1.2. Tracking Evaluation at Transients

In the transient tests, the transient period is set as 1s, and the demand engine speed is fixed at 1800 rpm. The engine load switches between 260 Nm and 700 Nm, which is demonstrated as the left column of Fig. 20. To reduce the overshoots in transients, χ_{vgt} is allowed to vary between [0.3, 0.9]. The right column of Fig. 20 shows the performance of engine speed recovery in load acceptance. As a

comparison, a 2I2O controller is implemented on the ETDE, with the ETA being shut off. In the 2I2O control, χ_{vgt} and χ_{egr} are used to control p_{in} and W_{egr} , where the controller is also built from the `systeme` solver. The engine speed recovers to the desired value 1800 rpm much faster in the 3I3O control mode, owing to that the ETA works in the motoring mode during load acceptance.

The p_{exh}^* at low load and high load are set as 215 kPa and 265 kPa, respectively. The tracking performances in transients are illustrated as the left column of Fig. 21. At the high load, p_{in}^* and W_{egr}^* are around 250 kPa and 0.047 kg/s, respectively. At the low load, p_{in}^* and W_{egr}^* are around 170 kPa and 0.026 kg/s, respectively. Small spikes are observed on p_{in}^* and W_{egr}^* when operating point changes, as they are read from look-up tables respect to N and T_L through gain scheduling. Unified promising performances are guaranteed in both steady states and transients. Only small overshoots are induced in the tracking due to the fast regulation of the centralized controller.

The corresponding actuator actions are shown as the right column of Fig. 21. When the engine operating point switches from low load to high load, χ_{vgt} closes to its lower limit, together with P_{em} works at the maximum motoring power, to offer maximum boosting. All the actuator actions converge to the steady values quickly. Only gain values rather than the system models are scheduled when operating point changes, which reduces the risk of system instability.

7.2. Evaluation of the Two-Level Controllers

The performance of the two-level controllers in energy management is validated under block loads, while the operating condition is shown as Fig. 22. The testing time is 822 s, while p_{exh}^* is updated in real-time according to the SOC variation. Two cases are tested, in which SOC_0 is set as 20% and 80%, respectively. In the both cases, SOC^* is set as 50%.

In the case of $SOC_0 = 20\%$, the change in battery SOC is illustrated in Fig. 23. The battery SOC converges to SOC^* fast and is attracted around it. The tracking performances are shown in Fig. 24. The desired values of all the three variables are very well tracked. The actuator actions are shown in Fig. 25. The ETA switches between the the motoring mode and the generating mode in real-time to adapt with both the transients acceleration/deceleration and the variation of battery SOC.

In the case of $SOC_0 = 80\%$, the SOC recovery performance is also excellent, as shown in Fig. 26. In this case, the setpoints of all the control variables are very well tracked, similar as in Fig. 24 and Fig. 25.

8. Conclusions

An integrated two-level real-time energy management framework for the ETDE is proposed in this paper. The control inputs and control outputs are identified based on the control-oriented characterisation of the newly designed electrified engine. The boundaries of control variables are identified to guarantee that they are reachable within the allowed actuator action ranges. Initially, a model-based H_∞ MIMO controller is designed with the non-smooth method. The tracking performance of the controller is shown to be fast and accurate in both transient and steady state conditions. On top of the low level MIMO controller, the supervisory level controller optimises the fuel economy in real-time. At the same time, the sustainable usage of battery is well guaranteed based on the closed-loop control of battery SOC. Since the optimal values of air system critical variables are read from look-up tables, instant distribution of the desired energy flows is achieved. The transient response is accelerated because of the ETA assistance. The effectiveness of the proposed integrated energy management framework is demonstrated with the simulation results obtained on a high fidelity physical engine model. The next step work would be the verification of the proposed energy management strategy on an experimental test bed.

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Acronyms

Acronym	Full name
EM	electric machine
ETDE	electrified turbocharged diesel engine
HDV	heavy duty vehicle
VGT	variable geometry turbine
EGR	exhaust gas recirculation
MIMO	multi-input multi-output
SOC	state-of-charge
ETA	electric turbo assist
SRM	switched reluctance motor
ECU	engine control unit
NRMSD	normalized root-mean-square deviation
NO _x	nitrogen oxides
PM	particulate matters
ORC	Organic Rankine Cycle
TEG	thermal electric generator

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