

**Diesel Air-Path Engine Control
using MPC**

Volvo Group Trucks Technology
Esteban R. Gelso
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Outline

- Volvo Group Introduction
- Introduction to the engine control problem
- Diesel engine air path control problem
- MPC Design Process
- Application example
- Conclusions

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The Volvo Group is one of the world's leading manufacturers of trucks, buses, construction equipment and marine and industrial engines. The Volvo Group also provides complete solutions for financing and service.

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The Volvo Group, which employs about 100,000 people, has production facilities in 19 countries and sales of products in more than 190 markets.

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GROUP TRUCKS TECHNOLOGY

RESEARCH AND
TECHNOLOGY DEVELOPMENT
for the Volvo Group










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INTRODUCING GROUP TRUCKS TECHNOLOGY

Scope and responsibilities within Volvo Group

	TRUCKS	BUSES	CONSTRUCTION EQUIPMENT	VOLVO PENTA	FINANCIAL SERVICES	EXTERNAL CUSTOMERS (outside Volvo Group)	
Volvo Group Trucks Technology							
	Global Product Planning						
	Advanced Technology & Research						
	Range & Projects Management						
	Complete Vehicle						
	Powertrain Engineering						
	Vehicle Engineering						
	Quality and Customer Satisfaction						
Technology, Product & Sourcing & Steering Committees							

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Sustainable transport solution technologies for society today and in the future

RENEWABLE FUELS	ALTERNATIVE DRIVELINES	FUEL ECONOMY	NOISE REDUCTION	SAFETY FOR DRIVERS AND SURROUNDINGS
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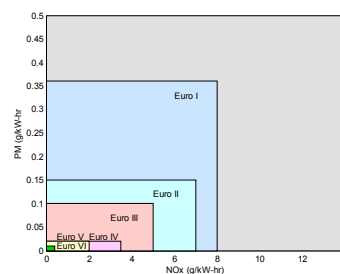
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Introduction

- Environmental requirements of Diesel engines have continuously increased over the last years.

— *new emissions legislation limits*



For example, emissions of nitrogen oxides (NOx) and particulate matter (PM) have reduced approx. 97% since 1980 with help from the Euro VI* and US10 emissions standards.

*latest European Union directives concerning emission standards for vehicles sold in EU countries.

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Introduction

- Performance and fuel efficiency improvement
- Additional hardware
 - multiple coupled actuators
 - increased complexity of the control strategies, more degrees of freedom available for control
 - systems with several input and output variables



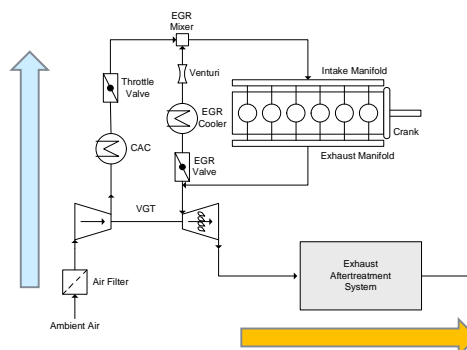
multivariable control

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Diesel engine air path control problem

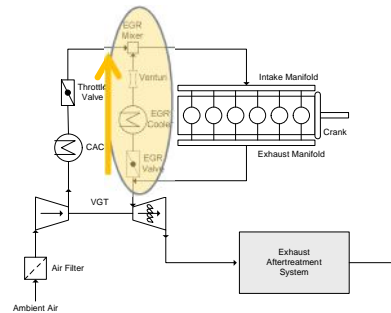
- For example, lets consider the air-path of an EGR-VGT engine



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Diesel engine air path control problem

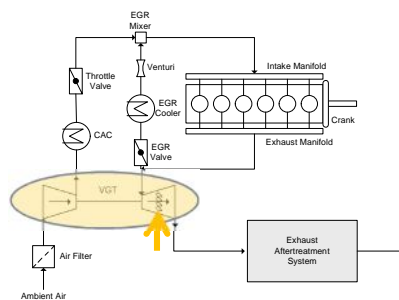


- Exhaust gas recirculation (EGR) has been introduced to reduce NO_x emissions
 - *But fuel economy and performance are also affected*

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Diesel engine air path control problem



- Variable Geometry Turbochargers (VGT) let control the turbine vanes position and then performance
 - *But fuel economy and NO_x emissions are also affected*

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Diesel engine air path control problem

- Exhaust gas recirculation (EGR) has been introduced to reduced NOx emissions
 - *But fuel economy and performance are also affected*
- For example, Variable Geometry Turbochargers (VGT) let control the turbine vanes position and then performance
 - *But fuel economy and NOx emissions*

MIMO system - multivariable control

MPC is a very good alternative!

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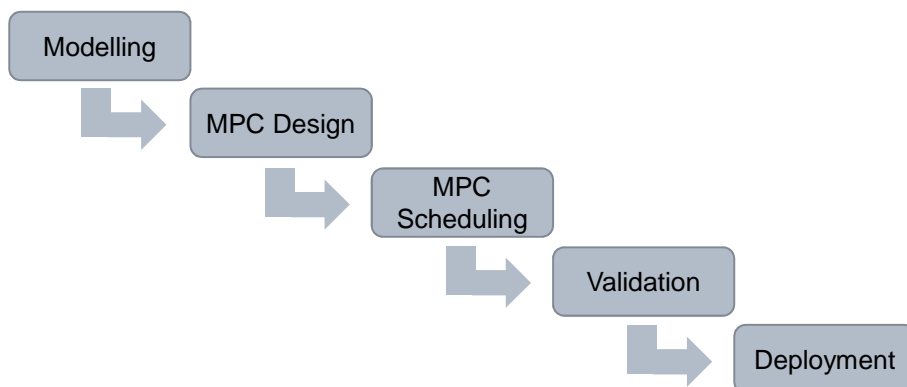
Diesel engine air path control problem

- Very challenging calibration of the traditional open-loop or SISO control loops approaches
- + Model Predictive Control handles constraints explicitly
- + Plant behavior in the future predicted using the MPC internal models
- But in general with higher computational complexity and demanding more memory than traditional controllers based on feedforward maps and feedback controllers such as PID

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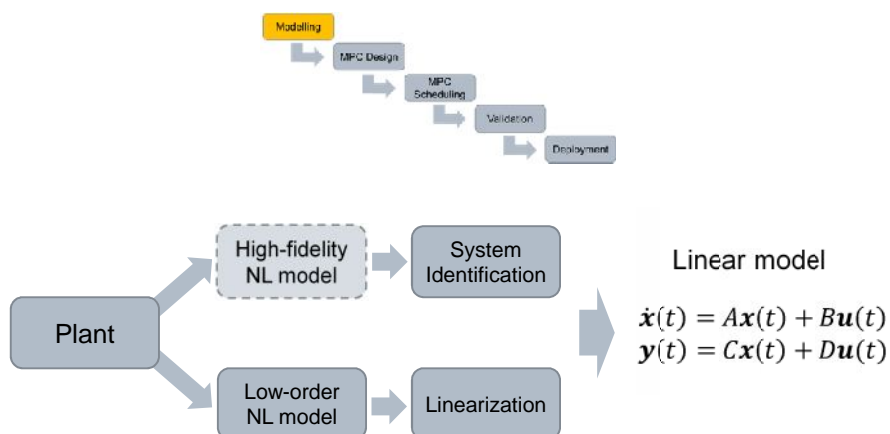
MPC Design Process Example multilinear case



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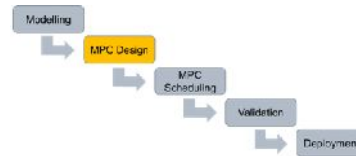
MPC Design Process Example multilinear case



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MPC Design Process Example multilinear case



- The problem is formulated as an optimal control problem with constraints

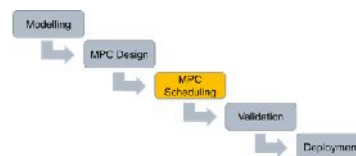
- Cost function (e.g. to minimize fuel consumption)
- Model
- Inequality constraints (e.g. actuator limits)

$$\begin{aligned}
 \min \quad & \sum_{j=0}^{N-1} \gamma_2(k+j-1) + \sum_{j=0}^{N-1} [\gamma_1(k+j) - \gamma_1(k+j-1)] R_1 + \\
 & \gamma_2(k) \sum_{i=1}^{N-1} c_1(k+j-1) \gamma_1 + \sum_{i=1}^{N-1} c_2(k+j-1) \\
 \text{st} \quad & \gamma(k+j-1) = \gamma(k+j) + \gamma_1(k+j) - \gamma_1(k+j-1) \quad j=0, \dots, N-1 \\
 & \gamma(k+j) = \gamma(k+j-1) + \gamma_1(k+j) - \gamma_1(k+j-1) \quad j=0, \dots, N-1 \\
 & \gamma_1(k+j) \geq \gamma_{1,min} \quad j=0, \dots, N-1 \\
 & \gamma_2(k+j) \geq \gamma_{2,min} \quad j=0, \dots, N-1 \\
 & \gamma_1(k+j) \leq \gamma_{1,max} \quad j=0, \dots, N-1 \\
 & \gamma_2(k+j) \leq \gamma_{2,max} \quad j=0, \dots, N-1 \\
 & \gamma_1(k+j) \geq 0 \quad j=0, \dots, N-1 \\
 & \gamma_2(k+j) \geq 0 \quad j=0, \dots, N-1 \\
 & \gamma_1(k+j) \leq 1 \quad j=0, \dots, N-1 \\
 & \gamma_2(k+j) \leq 1 \quad j=0, \dots, N-1
 \end{aligned}$$

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MPC Design Process Example multilinear case



- Multiple linear models at different operating conditions.
- They are used for the design of a gain-scheduled model predictive controller.

Linear models

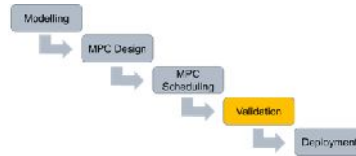
$$\begin{aligned}
 \dot{\mathbf{x}}(t) &= \mathbf{A}_i \mathbf{x}(t) + \mathbf{B}_i \mathbf{u}(t) \\
 \mathbf{y}(t) &= \mathbf{C}_i \mathbf{x}(t) + \mathbf{D}_i \mathbf{u}(t)
 \end{aligned}$$

$$i \in [1, n_{LM}]$$

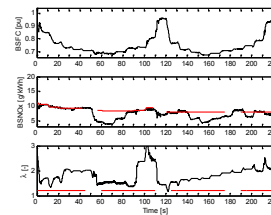
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MPC Design Process Example multilinear case



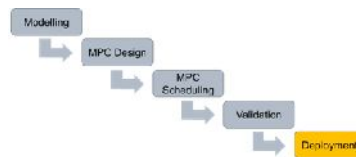
- Model-in-the-loop and SW-in-the-loop testing
 - Calibration of the MPC controller
 - Validation of the MPC controller performance



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MPC Design Process Example multilinear case



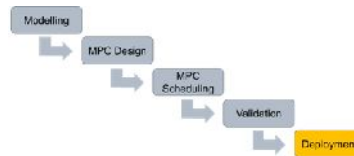
- Generation of code to be compiled to the Embedded System – EECU (engine electronic control unit)
- Implicit MPC QP solver to be embedded must be fast enough to provide a solution within short sampling intervals (20-80 ms) and require little memory (order of kB)



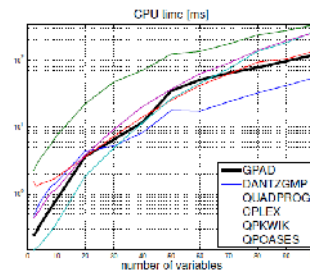
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MPC Design Process Example multilinear case



- Extremely important to choose a suitable QP solver and keep the number of variables as low as possible.
- We have used among others
 - CVXGEN tool, Mattingley and Boyd (2012),
 - FORCES Pro tool, Domahidi and Jerez (2014)



*Bemporad & Patrino (2012)

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MPC Design Process Example multilinear case

- We reformulate the MPC optimization problem in the form of a standard QP problem, so that it can be solved using an online standard QP solver.
- The MPC problem is stated as

$$\min_U \frac{1}{2} U^T H U + U^T g(w)$$

$$\text{s.t. } G U \leq b(w)$$

with two matrices, the Hessian matrix H and the constraint matrix G ; and two vectors depending affinely on a varying parameter w that includes e.g. set-points and input disturbances.

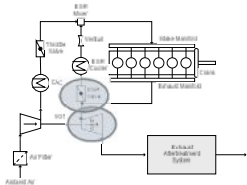
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Application example EGR-VGT engine

Main control objectives:

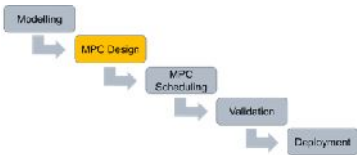
- Minimize fuel consumption,
- Minimize tracking errors of the fraction of Burned Gases in the intake manifold



Challenges:

- Highly nonlinear MIMO system
- Fast sampling time ($\approx 20\text{ ms}$)
- Limited memory in ECU
- Hard constraints (limits on actuators)
- Soft constraints (safety limits, ...)

Application example EGR-VGT engine



$$\begin{aligned} \min_u \quad & \sum_{j=0}^{N-1} y_1(k+j+1) \\ & - q_2 \sum_{j=0}^{N-1} (y_2(k+j+1) - y_2^*(k))^2 \\ & + \sum_{j=0}^N \|u_e(k+j) - u_s(k+j-1)\|_{Q_s}^2 \\ & + q_4 \sum_{j=1}^N c(k+j) \\ \text{s.t.} \quad & x(k+j+1) = A_{d,i}x(k+j) + B_{e,i}u_e(k+j) + D_{d,i}u_d(k+j) \\ & \quad j = 0, \dots, N-1 \\ & y(k+j) = C_{d,i}x(k+j) + D_{e,i}u_e(k+j) + D_{d,i}u_d(k+j) \\ & \quad j = 1, \dots, N \\ & u_e(k+j) > u_{\min} \quad j = 0, \dots, N \\ & u_e(k+j) \leq u_{\max} \quad j = 0, \dots, N \\ & y_{3\min}^*(k) < y_3(k+j) < y_{3\max}^*(k) \\ & \quad j = 1, \dots, N \\ & c(k+j) \geq 0 \quad j = 1, \dots, N \end{aligned}$$

Application example EGR-VGT engine – Experimental results*

- 13 L heavy duty Volvo Diesel engine, certified for the Tier 4 final emission legislation
 - For heavy machines like articulated haulers, wheel loaders, and excavators.
- The number of stationary operating points used to obtain the local linear models and cover the entire engine operating region is 192.
- The sampling time is set to 20 ms.
- The prediction horizon is set to 1 s.



* Gelso, Esteban R., and Johan Dahl. "Air-Path Control of a Heavy-Duty EGR-VGT Diesel Engine." *IFAC-PapersOnLine* 49.11 (2016): 589-595.

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EGR-VGT engine – Experimental results

MPC controller results compared to the ones obtained with a baseline controller.

Baseline controller standard control structure in industry: feedforward maps + feedback control.

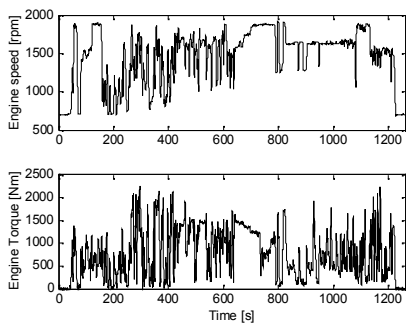


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Experimental Results

- Experimentally validated on an engine test bench with the Non-Road Transient Cycle (NRTC), i.e. emission certification transient cycle for non-road Diesel engines.
- Cycle total duration approx. 20 min.

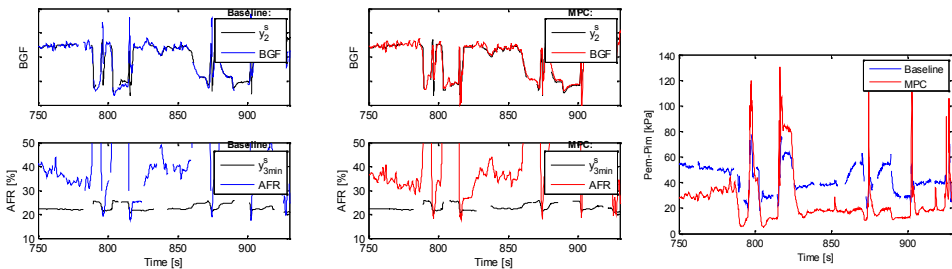


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Experimental Results

- Comparison of the outputs during a 3 min transient portion of the NRTC.



	Baseline	MPC
BGF error	1.00	0.51
Pumping losses	1.00	0.65
AFR error	1.00	1.06
Cycle energy	1.000	1.004
BSFC	1.000	0.958
BSNOx	1.00	1.01
BSHC	1.00	0.93
Mean exh.temp	1.00	1.08

Conclusions

- MPC successfully applied to the air-path control problem of Diesel engine
 - It can significantly reduce the engine optimization time and at the same time improve e.g. transient response
- MPC controllers fitted in production ECUs and run in the order ms
 - Validated through real-world experiments in engine test bench and in vehicles
- Different engine concepts have been tested
 - Excellent performance