Modeling and control of Rankine based waste heat recovery systems for heavy duty trucks

# Vincent GRELET $^{1,2,3}$ , Thomas REICHE $^1$ , Madiha NADRI $^2$ , Pascal DUFOUR $^2$ and Vincent LEMORT $^3$

 <sup>1</sup>Volvo Group Trucks Technology Advanced Technology and Research, 1 avenue Henri Germain, 69800 Saint Priest, France
 <sup>2</sup>Université de Lyon, Lyon F-69003, Université Lyon 1, CNRS UMR 5007, Laboratory of Process Control and Chemical Engineering (LAGEP), Villeurbanne 69100, France
 <sup>3</sup>LABOTHAP, University of Liege, Campus du Sart Tilman Bat. B49 B4000 Liege, Belgium

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### Context and motivations heat recovery Rankine cycle based Studied system Control oriented modeling Controller development Simulation results

Contacts and discussion

# Context and motivations

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Contacts and discussion

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- Waste heat recovery based on the Rankine cycle is a promising technique to increase fuel efficiency.



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# Context and motivations

- In nowadays heavy duty engines, a major part of the chemical energy contained in the fuel is released to the ambient through heat.
- Waste heat recovery based on the Rankine cycle is a promising technique to increase fuel efficiency.
- Long and frequent transient behavior of the heat sources makes good control strategies mandatory.



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  - It is then pre-heat, vaporize and superheat (2 → 3).
  - It expands from evaporating to condensing pressure (3 → 4).
  - It condenses and goes back to liquid state  $(4 \rightarrow 1)$ .



# Studied system



Model assumptions and governing equations Heat transfer Working fluid properties Discretization

# Model assumptions and governing equations

# Model assumptions

- Geometry is reduced to a single pipe in pipe HEX.
- Secondary (or transfer) fluid always in single phase.
- Conduction is neglected.
- Pressure drops are neglected.
- Pressure dynamic is neglected.
- Fluid properties are evaluated at the outlet of each node.
- Mass flow rates are supposed constant along the HEX.

# Governing equation

Internal fluid

$$A_{cross,f} \frac{\partial \rho_f h_f}{\partial t} + \frac{\partial \dot{m}_f h_f}{\partial z} + \dot{q}_{f,int} = 0. \quad (1)$$

Internal pipe wall

$$\dot{q}_{f,int} + \dot{q}_{g,int} = \frac{\partial m_{w,int} c_{P_{w,int}} T_{w,int}}{\partial t}.$$
 (2)

• External fluid  $\frac{\partial \dot{m}_g c_{\rho_g} T_g}{\partial z} + \frac{\partial \dot{m}_g c_{\rho_g} T_g}{\partial t} + \dot{q}_{g,int} + \dot{q}_{g,ext} = 0.$ (3)

• External pipe wall  

$$\dot{q}_{g,ext} + \dot{q}_{amb,ext} = \frac{\partial m_{w,ext} c_{p_{w,ext}} T_{w,ext}}{\partial t}.$$
 (4)

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# Heat transfer

# Heat transfer coefficients

$$\begin{array}{rcl}
\alpha_{g} &=& \alpha_{ref,g} \dot{m}_{g}^{n_{g}} & (5) \\
\alpha_{f,liq} &=& \alpha_{ref,f,liq} \dot{m}_{f}^{n_{f,liq}} & (6) \\
\alpha_{f,2\varphi} &=& \alpha_{f,liq} \dots & \\
& & \dots \left\{ \left(1-q\right)^{0.01} \left[ (1-q) + 1.2q^{0.4} \frac{\rho_{f,sat,liq}}{\rho_{f,sat,vap}} \right]^{-2.2} + \dots & \\
& & \dots q^{0.01} \left[ \frac{\alpha_{f,vap}}{\alpha_{f,liq}} \left(1 + 8(1-q)^{0.7} \frac{\rho_{f,sat,liq}}{\rho_{f,sat,vap}} \right)^{-2} \right\}^{-0.5} & (7) \\
\alpha_{f,vap} &=& \alpha_{ref,f,vap} \dot{m}_{f}^{n_{f,vap}} & (8)
\end{array}$$

# Heat transfer

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# Heat transfer EGR boiler

# Heat transfer exhaust boiler



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# Working fluid properties

# Working fluid properties models

• Temperature:

$$T_{f} = \begin{cases} a_{T,liq}h_{f}^{2} + b_{T,liq}h_{f} + c_{T,liq} & \text{if } h_{f} \leq h_{sat,liq} \\ T_{sat,liq} + q \left( T_{sat,vap} - T_{sat,liq} \right) & \text{if } h_{sat,liq} \geq h_{f} \leq h_{sat,vap} \\ a_{T,vap}h_{f}^{2} + b_{T,vap}h_{f} + c_{T,vap} & \text{if } h_{f} \geq h_{sat,vap} \end{cases}$$
(9)

Density

$$\rho_{f} = \begin{cases}
a_{\rho,liq}h_{f}^{2} + b_{\rho,liq}h_{f} + c_{\rho,liq} & \text{if } h_{f} \leq h_{sat,liq} \\
\frac{1}{a_{\rho,2\varphi}h_{f} + b_{\rho,2\varphi}} & \text{if } h_{sat,liq} \geq h_{f} \leq h_{sat,vap} \\
a_{\rho,vap}h_{f}^{2} + b_{\rho,vap}h_{f} + c_{\rho,vap} & \text{if } h_{f} \geq h_{sat,vap}
\end{cases} (10)$$

# Working fluid properties

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### Temperature model validation 800 700 Temperature (K) 000 (K) 400 -Liquid Saturation Vapor Saturation 300 Calculated ----Reference 200 1000 1500 500 2000 2500 Enthalpy (kJ/kg)

# Density model validation



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# Discretization

- The continuous set of equation (1,2,3,4) is discretized with respect to space based finite differences.
- A finite volume approach is chosen where the HEX is split into n longitudinal cell.
- The vector u contains the manipulated variable  $\dot{m}_{f,0}$  and the input disturbances:  $\dot{m}_{g,L}$ ,  $T_{g,L}$ ,  $h_{f,0}$ ,  $P_{f,0}$ .



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# Discretization

• The system of equations defining the response of the i<sup>th</sup> cell of the discretized model is:

$$\dot{x}_i = f_i(x_i, u), \tag{11}$$

where: 
$$u = [\dot{m}_{f,0} \quad P_{f,0} \quad h_{f,0} \quad \dot{m}_{g,L} \quad T_{g,L}],$$
 (12)

$$x_i = \begin{bmatrix} h_{f,i} & T_{w,int,i} & T_{g,i} & T_{w,ext,i} \end{bmatrix},$$
(13)

$$f_{i}(x_{i}, u) = \begin{bmatrix} \frac{\frac{m_{f}\left(h_{f,i-1}-h_{f,i}\right)-\alpha_{f,i}A_{exch,f,int}\left(T_{f,i}-T_{w,int,i}\right)}{\rho_{f,i}V_{f}} \\ \frac{\alpha_{f,i}A_{exch,f,int}\left(T_{f,i}-T_{w,int,i}\right)+\alpha_{g}A_{exch,g,int}\left(T_{g,i}-T_{w,int,i}\right)}{\rho_{w,int}V_{w,int}} \\ \frac{\frac{m_{g}c_{pg}\left(T_{g,i-1}-T_{g,i}\right)-\alpha_{g}\left[A_{exch,g,int}\left(T_{g,i}-T_{w,int,i}\right)-A_{exch,g,ext}\left(T_{g,i}-T_{w,ext,i}\right)\right]}{\rho_{g,i}V_{g}c_{pg}} \\ \frac{\alpha_{amb}A_{exch,amb,ext}\left(T_{amb}-T_{w,ext,i}\right)+\alpha_{g}A_{exch,g,ext}\left(T_{g,i}-T_{w,ext,i}\right)}{\rho_{w,ext}V_{w,ext}} \end{bmatrix}$$
(14)

Implementation constraint Model identification State of the art PID controller Nonlinear model inversion Controllers structure

# Implementation constraint

Classical automotive electronic control unit (ECU) constrains the implementation of controllers:

- Simulink based environment.
- Controller must be discretized in time.
- Backward Euler integration scheme has to be used with a sample time of 20ms.
- Calculation must stay as simple as possible (problems have to be rescaled to avoid the use of high computational capacity demand functions).

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# Model identification

- First order plus time delay models are identified in open loop around several operating points with output error minimization algorithm.
- The dynamic relation between the working fluid temperature and mass flow variations is:

$$\frac{\Delta T_{f,L}}{\Delta \dot{m}_f} = \frac{G}{1+\tau s} e^{-Ds}.$$
 (15)

• According to the non linearity of model 11 FOPTD parameters vary a lot.



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# State of the art PID controller

- State of the art controller in the automotive industry is the PID controller.
- A well known improvement is the gain scheduling approach.
  - Gains are calculated offline and linearly interpolated according to the mass flow sensor signal.
- Several PID tuning methods have been compared on a load step change.



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# Nonlinear model inversion

- Fastest dynamics (i.e. fluid and gas) are canceled.
- Single phases working fluid heat transfer coefficients are assumed constant.
- The system of equations defining the response of the i<sup>th</sup> cell can be written:

$$\begin{pmatrix}
0 &= \dot{m}_{f} \left( h_{f_{i-1}} - h_{f_{i}} \right) + \dot{Q}_{f_{int_{i}}} \\
\frac{\partial T_{w_{int_{i}}}}{\partial t} &= \dot{Q}_{f_{int_{i}}} + \dot{Q}_{g_{int_{i}}} \\
0 &= \dot{m}_{g} c_{\rho_{g}} \left( T_{g_{i-1}} - T_{g_{i}} \right) + \dot{Q}_{g_{int_{i}}} + \dot{Q}_{g_{ext_{i}}} \\
\frac{\partial T_{w_{ext_{i}}}}{\partial t} &= \dot{Q}_{g_{ext_{i}}} + \dot{Q}_{amb_{ext_{i}}}.
\end{cases}$$
(16)

• The expression of the feedforward term  $U_{feedforward}$  is then straightforward:

$$U_{feedforward} = \frac{\sum_{i=1}^{N} \dot{Q}_{f_{int_i}}}{h_{f_0} - h_{f_L}}.$$
(17)

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# Controllers structure



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# Controllers structure





# Simulation environment

Pump and expansion machine models are added to represent the high pressure part of the Rankine system.

• Pump model:

$$\dot{m}_f = \rho_{f,in} \frac{N_{pump}}{60} C_{c_{pump}} \eta_{vol,pump}.$$
(18)

• Expansion machine:

$$\dot{m}_{f} = k_{eq} \sqrt{\rho_{f,in} P_{f,in} \left(1 - \frac{P_{f,in}}{P_{f,out}}^{-2}\right)}.$$
(19)



# Controller comparison

- Initial set point and disturbances change are not handle by PID controller.
- The non linear controller reduce the deviation from +/-10°Cwith the PID to +/-3°C.



# Conclusion and next steps

# Conclusion

- A control strategy for temperature management of WHRS Rankine cycle based is presented.
- Main objective to stabilize the temperature around a given set point is better achieved by using a non linear controller.
- Non linear controller is compliant with implementation constraint relative to automotive industry.

# Next steps

- Controller sensitivity to parameters mismatch.
- Controller robustness.
- Optimal high level control strategy (set points generation).

# Contacts and discussion

## Authors

- Vincent GRELET: vincent.grelet@volvo.com
- Thomas REICHE: thomas.reiche@volvo.com
- Madiha NADRI: nadri@lagep.univ-lyon1.fr
- Pascal DUFOUR: dufour@lagep.univ-lyon1.fr
- Vincent LEMORT: vincent.lemort@ulg.ac.be

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