

Transformed Manipulated Variables for Perfect Decoupling and Disturbance Rejection

Cristina Zotică^a, Nicholas Alsop^b, Sigurd Skogestad^{a,*}

^aDepartment of Chemical Engineering
Norwegian University of Science and Technology (NTNU)

^bSenior Process Control Engineer, Borealis AB



* *sigurd.skogestad@ntnu.no*

June 2020



- 1 Introduction
- 2 New proposed method
- 3 Examples
 - Control of flow and temperature in a mixing process
 - Control of hot outlet temperature of a heat exchanger
- 4 Conclusions and future work

1. Introduction

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Find new manipulated variables

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- accurate process inverse \Rightarrow lack of robustness to model uncertainty

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Related alternatives

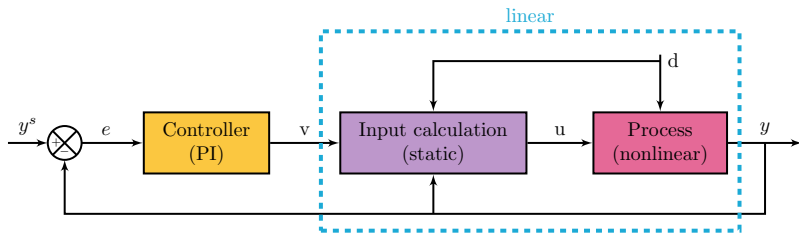
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- non-robust decoupling control \Rightarrow difficult to extend to MIMO
- cannot explicitly handle process constraints
- state measurement
- only for minimum phase systems \Rightarrow no RHP-zeros and time delay
- give a chain of integrators
- not for static systems

2. New proposed method

Input transformation



$y \in \mathbb{R}^{n_y}$ outputs

$u \in \mathbb{R}^{n_u}$ original inputs

$v \in \mathbb{R}^{n_u}$ new transformed inputs

$d \in \mathbb{R}^{n_d}$ disturbances

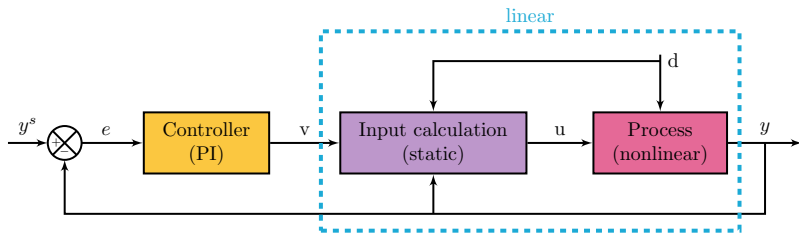
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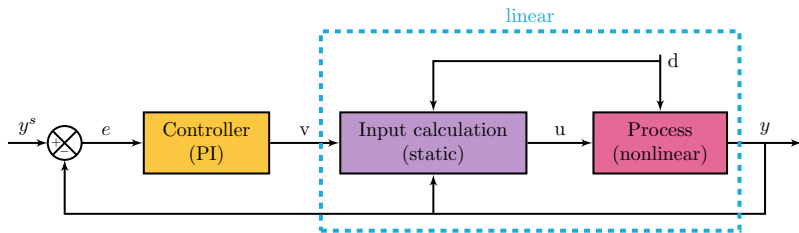
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- as many outputs (i.e. differential equations) as inputs ($n_y = n_u$)

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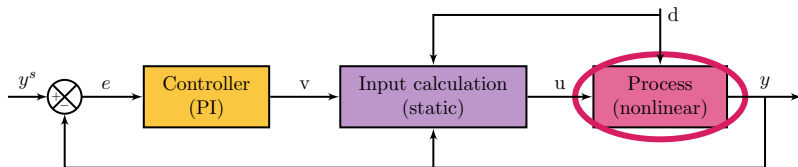
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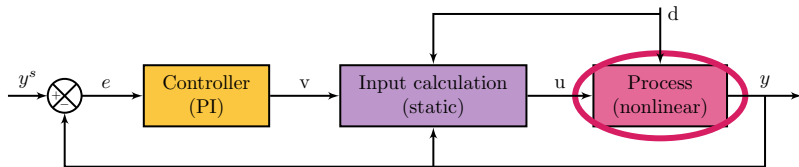
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Assumptions

- as many outputs (i.e. differential equations) as inputs ($n_y = n_u$)
- all disturbances can be measured



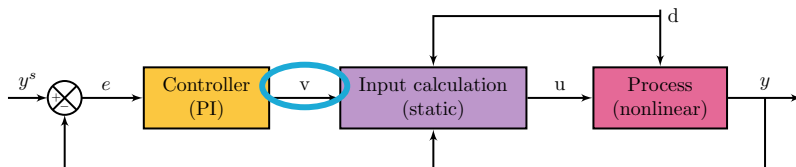
$y \in \mathbb{R}^{n_y}$ (outputs) $u \in \mathbb{R}^{n_u}$ (original inputs) $d \in \mathbb{R}^{n_d}$ (disturbances)



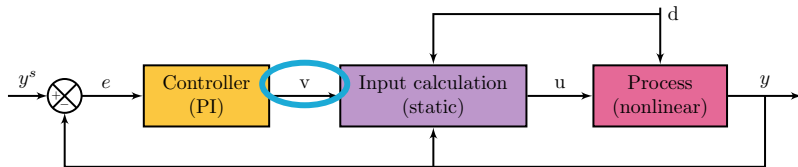
$y \in \mathbb{R}^{n_y}$ (outputs) $u \in \mathbb{R}^{n_u}$ (original inputs) $d \in \mathbb{R}^{n_d}$ (disturbances)

Model: $\frac{dy}{dt} = f(y, u, d)$

Transformed inputs



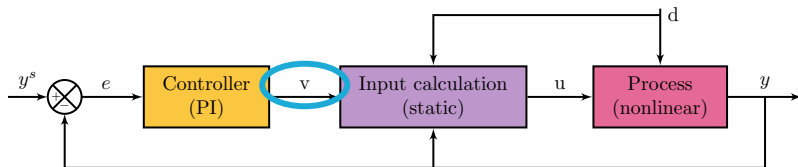
Transformed inputs



Input Transformations

- simple input transformation (feedback linearization) \Rightarrow integrating system

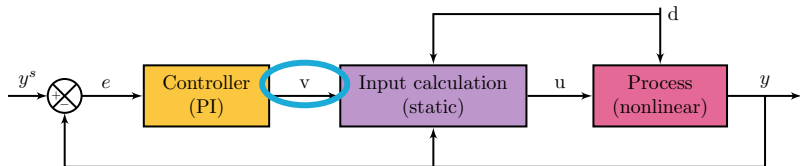
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- simple input transformation (feedback linearization) \Rightarrow integrating system
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Input Transformations

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- refined input transformation \Rightarrow first-order system

System: two $MV = [u_1 \ u_2]$, two $CV = [y_1 \ y_2]$ and a disturbance vector d

Simple input transformation

Model

$$\frac{dy_1}{dt} = f'_1(u_1, u_2, d, y_1, y_2) \quad \frac{dy_2}{dt} = f'_2(u_1, u_2, d, y_1, y_2)$$

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Define the new transformed inputs (v') as the RHS

$$v'_1 = f'_1(u_1, u_2, d, y_1, y_2)$$

$$v'_2 = f'_2(u_1, u_2, d, y_1, y_2)$$

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Two decoupled linear integrating systems independent of disturbances.

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Two decoupled linear integrating systems independent of disturbances.

- cannot handle static systems (e.g. perfect mixing without accumulation)
- only for integrating systems (e.g. level control)

Refined input transformation

New tuning parameter τ_0 and reformulated model

$$\tau_{01} \frac{dy_1}{dt} + y_1 = f_1(u_1, u_2, d, y_1, y_2)$$
$$\tau_{02} \frac{dy_2}{dt} + y_2 = f_2(u_1, u_2, d, y_1, y_2)$$

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$$\tau_{01} \frac{dy_1}{dt} + y_1 = f_1(u_1, u_2, d, y_1, y_2) \quad (2a)$$

$$\tau_{02} \frac{dy_2}{dt} + y_2 = f_2(u_1, u_2, d, y_1, y_2) \quad (2b)$$

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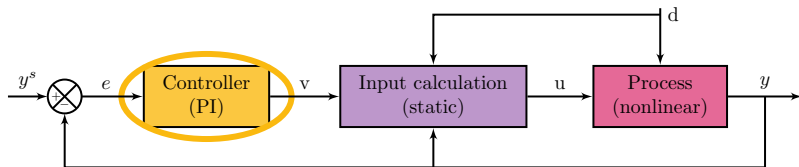
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Two decoupled first-order systems independent of disturbances.

τ_0 - free to choose. *intuitively* keep it close to the original system dynamics

Key idea: use decentralized SISO controllers for controlling $y = [y_1 \ y_2]$ using $v = [v_1 \ v_2]$ as inputs.



Calculation block

Simple transformation

$$\frac{dy}{dt} = v'$$

$$u = f'^{-1}(v', d, y)$$

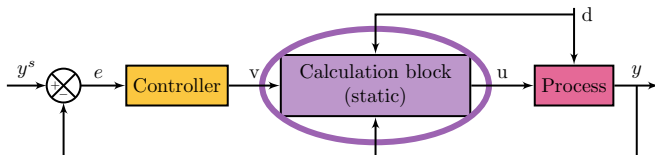
⇒ implicit nonlinear state feedback

Refined transformation

$$\tau_0 \frac{dy}{dt} + y = v$$

$$u = f^{-1}(v, d, y)$$

⇒ avoid implicit nonlinear state feedback if v is independent of y



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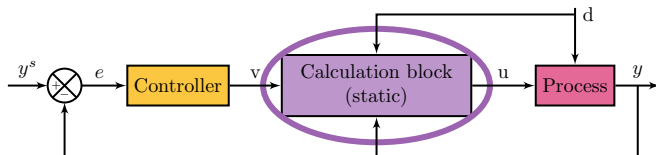
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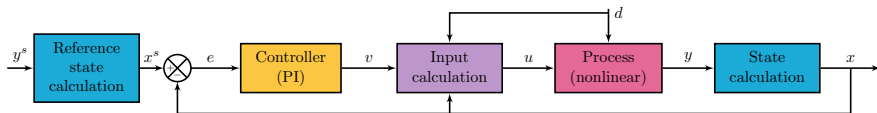
$$u = f^{-1}(v, d, y)$$

⇒ avoid implicit nonlinear state feedback if v is independent of y



- algebraic solver
- numerical solver
- PI-controller (inner slave loop)

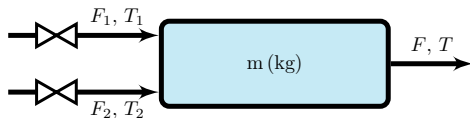
Output Transformation



$$\begin{aligned} y &\in \mathbb{R}^{n_y} \text{ (outputs)} & u &\in \mathbb{R}^{n_u} \text{ (original inputs)} \\ x &\in \mathbb{R}^{n_x} \text{ (states)} & d &\in \mathbb{R}^{n_d} \text{ (disturbances)} \end{aligned}$$

- measurement nonlinearity (e.g. pH, density)
- static calculation block: $x = h^{-1}(y)$

Control of flow and temperature in a mixing process



MVs (original inputs):

$$u_1 = F_1 \text{ [kg/s]}$$

$$u_2 = F_2 \text{ [kg/s]}$$

CVs (outputs):

$$y_1 = F \text{ [kg/s]}$$

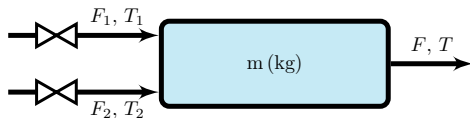
$$y_2 = T \text{ [}^\circ\text{C]}$$

DVs (disturbances):

$$d_1 = T_1 \text{ [}^\circ\text{C]}$$

$$d_2 = T_2 \text{ [}^\circ\text{C]}$$

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$$d_1 = T_1 \text{ [}^\circ\text{C]}$$

$$d_2 = T_2 \text{ [}^\circ\text{C]}$$

Objective: find new transformed inputs (new MVs), v_1 and v_2
 \Rightarrow decoupling and perfect disturbance rejection.

Mixing process. Transformed inputs

Mass balance (static) $F = \underbrace{F_1 + F_2}_{v_1}$

Mixing process. Transformed inputs

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Energy balance (dynamic)

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$$m \frac{dT}{dt} = F_1(T_1 - T) + F_2(T_2 - T)$$

Mixing process. Transformed inputs

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Energy balance (dynamic)

$$m \frac{dT}{dt} = F_1(T_1 - T) + F_2(T_2 - T)$$
$$\tau_0 \frac{dT}{dt} + T = \frac{\tau_0}{m} \underbrace{(F_1 T_1 + F_2 T_2)}_{v_2} + \left(1 - \frac{\tau_0}{\tau_r}\right) T$$
$$\tau_r = \frac{m}{F_1 + F_2}$$

Mixing process. Transformed inputs

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Tuning parameter τ_0

if $\tau_0 = \tau_r \Rightarrow v_2$ is independent of y .

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$$\tau_r = \frac{m}{F_1 + F_2}$$

New system:

$$y_1 = v_1$$
$$\tau_0 \frac{dy_2}{dt} + y_2 = v_2$$

Tuning parameter τ_0

if $\tau_0 = \tau_r \Rightarrow v_2$ is independent of y .

Algebraic solver

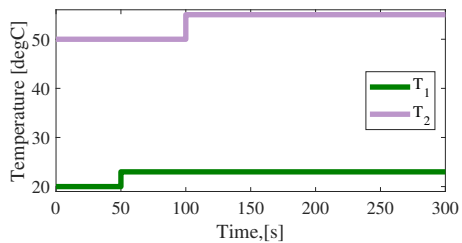
Solve for u_1 and u_2 :

$$v_1 = F_1 + F_2$$

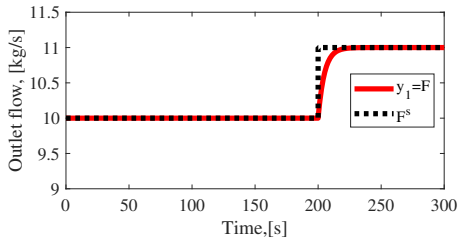
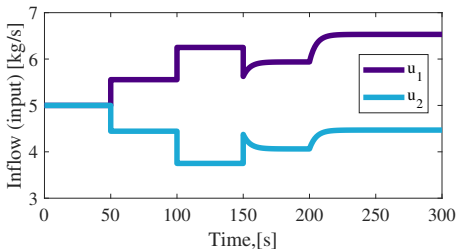
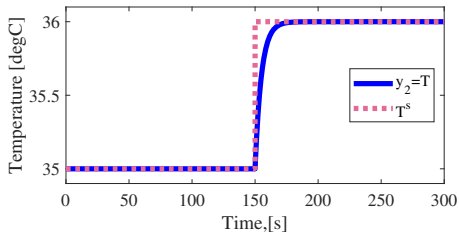
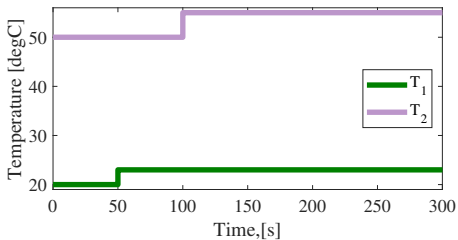
$$v_2 = \frac{\tau_0}{m}(F_1 T_1 + F_2 T_2) + \left(1 - \frac{\tau_0}{\tau_r}\right) T$$

Given inputs v_1 and v_2 , outputs $y_1 = F$ and $y_2 = T$, and disturbances $d_1 = T_1$ and $d_2 = T_2$.

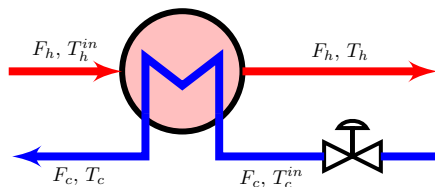
Mixing process. Closed loop responses



Mixing process. Closed loop responses



Control of hot outlet temperature of a heat exchanger



MVs (original inputs):

$$u = F_c \text{ [kg/s]}$$

CVs (outputs):

$$y = T_h \text{ [}^\circ\text{C]}$$

DVs (disturbances):

$$d_1 = T_c^{in} \text{ [}^\circ\text{C]}$$

$$d_2 = T_h^{in} \text{ [}^\circ\text{C]}$$

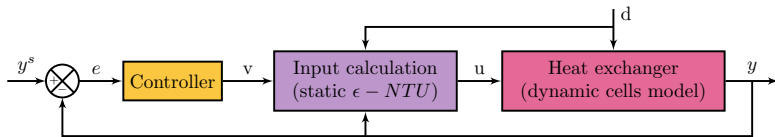
$$d_3 = F_h \text{ [kg/s]}$$

Heat exchanger. Input transformation

Objective: find transformed input (new MV), v
 \Rightarrow perfect disturbance rejection at steady-state.

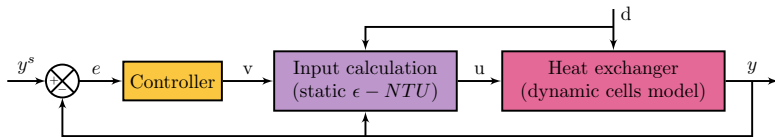
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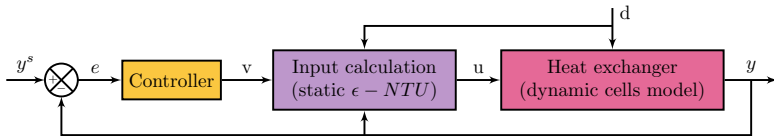
Energy balance (static $\epsilon - NTU$)

$$T_h = \underbrace{(1 - \epsilon_h) T_h^{in} + \epsilon_h T_c^{in}}_v$$

with $\epsilon_h = \epsilon_h(u, d_1, d_2, d_3)$

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Energy balance (static $\epsilon - NTU$)

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with $\epsilon_h = \epsilon_h(u, d_1, d_2, d_3)$

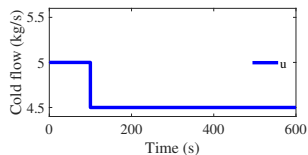
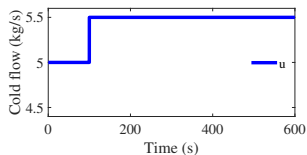
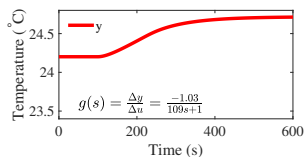
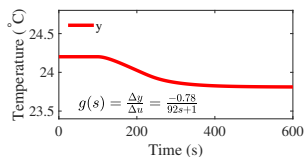
New system: $y = v$

Tuning parameter: $\tau_0 = 0$

Heat exchanger. Open loop responses

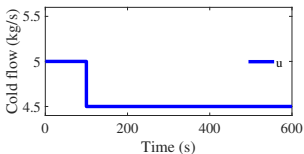
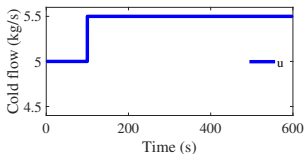
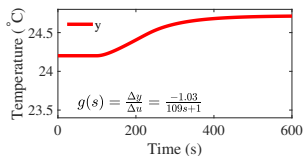
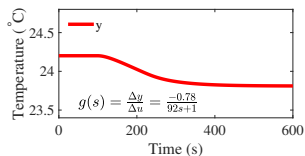
Consider actual dynamics with a static transformation and dynamic process

Original system

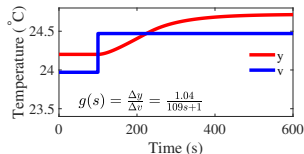
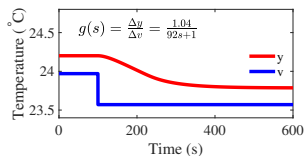


Heat exchanger. Open loop responses

Original system

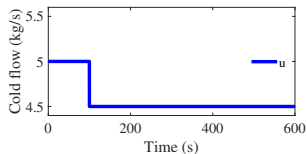
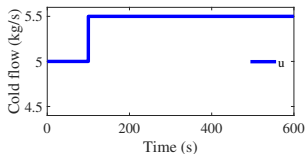
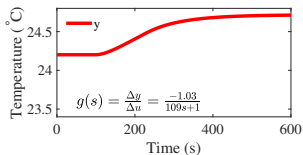
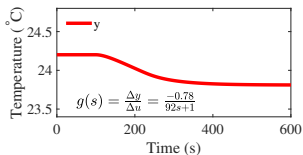


Transformed system



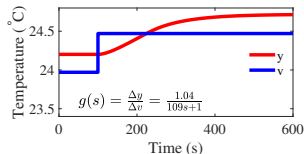
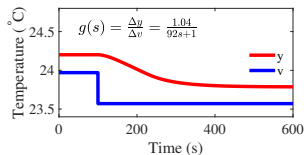
Heat exchanger. Open loop responses

Original system



Different steady-state gain

Transformed system



Same steady-state gain

3 different controllers implemented

- 1 feedback only with a PI-controller ($K_C = -1.32$, $\tau_I = 109$);

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- 2 transformed and feedback with a PI-controller ($K_C = 1.31$, $\tau_I = 109$);
- 3 transformed only (feedforward only).

Calculation block. Numerical solver

Solve for u

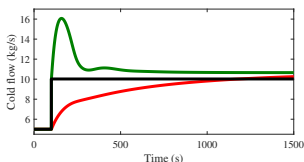
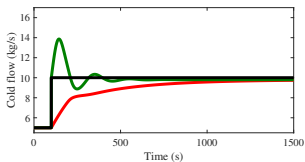
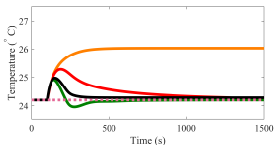
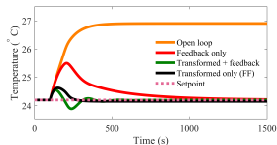
$$v = (1 - \epsilon_h) T_h^{in} + \epsilon_h T_c^{in}$$

with

$$\epsilon_h = \epsilon_h(u, d_1, d_2, d_3)$$

Given input v , and disturbance $d_1 = T_c^{in}$, $d_2 = T_h^{in}$, $d_3 = F_h$.

Disturbance rejection

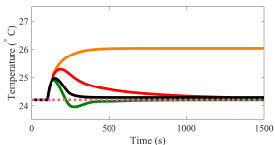
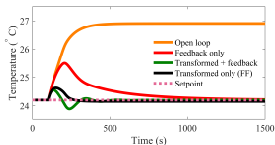


$$\Delta d_3 = 0.6 \text{ kg/s}$$

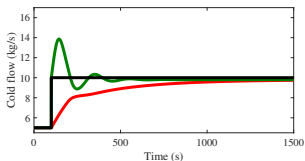
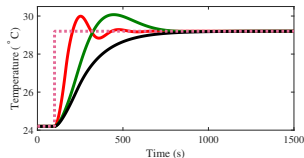
$$\Delta d_1 = 2 \text{ °C}$$

Heat exchanger. Closed loop responses

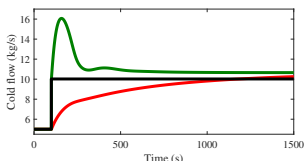
Disturbance rejection



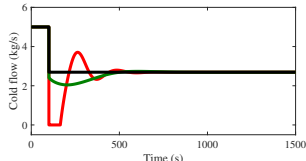
Setpoint change



$$\Delta d_3 = 0.6 \text{ kg/s}$$



$$\Delta d_1 = 2^\circ\text{C}$$



$$\Delta T_h^s = 5^\circ\text{C}$$

4. Conclusions

Transformed inputs

- perfect decoupling
- feedforward disturbance rejection
- new tuning parameter $\tau_0 \Rightarrow$ nonlinear system \Rightarrow first-order system

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- generalized theory for input and output transformations

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This work is partly funded by HighEFF - Centre for an Energy Efficient and Competitive Industry for the Future. The authors gratefully acknowledge the financial support from the Research Council of Norway and user partners of HighEFF, an 8 year Research Centre under the FME-scheme (Centre for Environment-friendly Energy Research, 257632).

