

# Optimal Startup of Chemical Plants and its Practical Implementation

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# Outline

- Startup of chemical plants
- Industrial example: Startup
- Startup: Operating procedure
- Startup: PI-control with target setpoints
- Startup: Dynamic optimization (offline)
- Startup: Nonlinear model predictive control (online)
- Startup: Self-optimizing control
- Interesting research areas
- Concluding remarks

# Startup of chemical plants

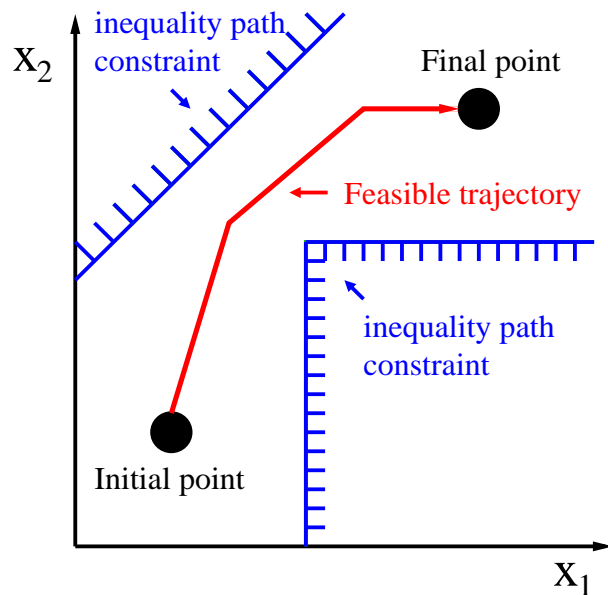
Def: Large change in operating point.

Characteristics:

- Strong nonlinearities
- Inequality path constraints
- Position constraints (e.g. final point)
- Varying physical/chemical phenomena

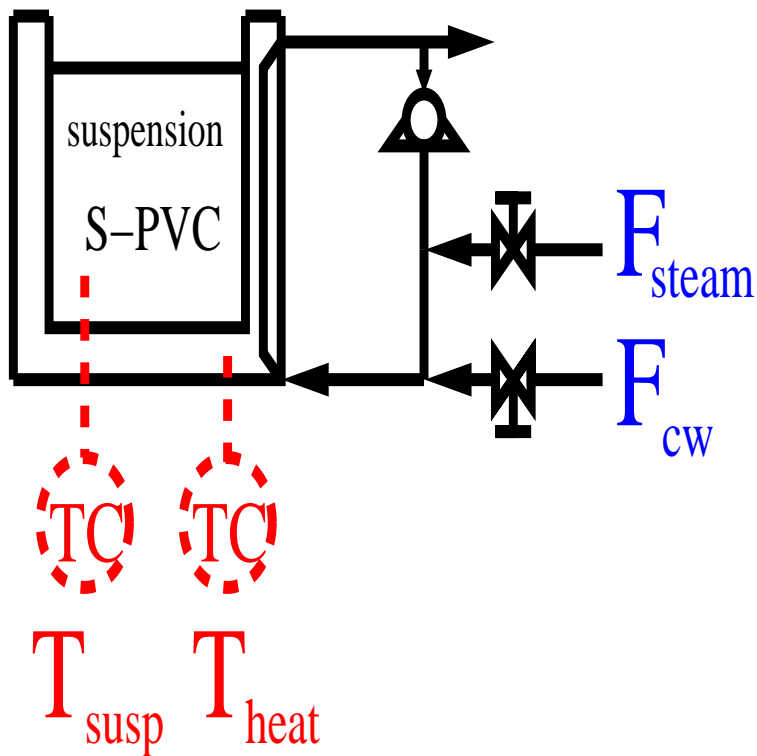
Objective:

- minimize transition time
- minimize energy / material usage
- minimize risk



# Example: Startup

## Norsk Hydro S-PVC plant, Porsgrunn, Norway



Manipulated variables:

$$u^T = [F_{cw} \quad F_{steam}]$$

Minimize startup time:

$$J = t_{final} - t_{init}$$

Constraints:

$$T_{heat}(t) \leq 90^\circ C$$

$$T_{susp}(t) \leq 52^\circ C$$

$$T_{susp}(t_{final}) = 50^\circ C$$

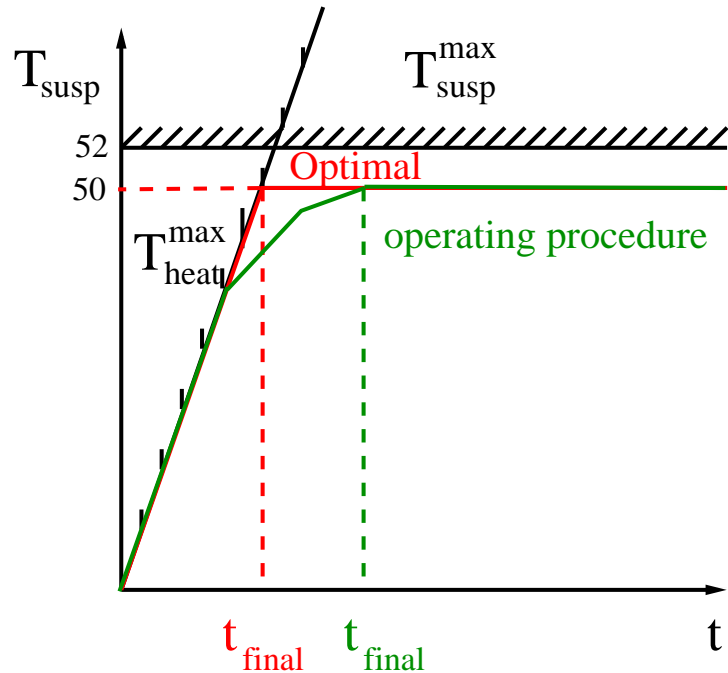
Disturbance:

$$d = T_{susp}(t_{init}) = [25 \pm 5^\circ C]$$

Measurements:

$$y^T = [T_{susp} \quad T_{heat}]$$

# Startup: Operating procedure



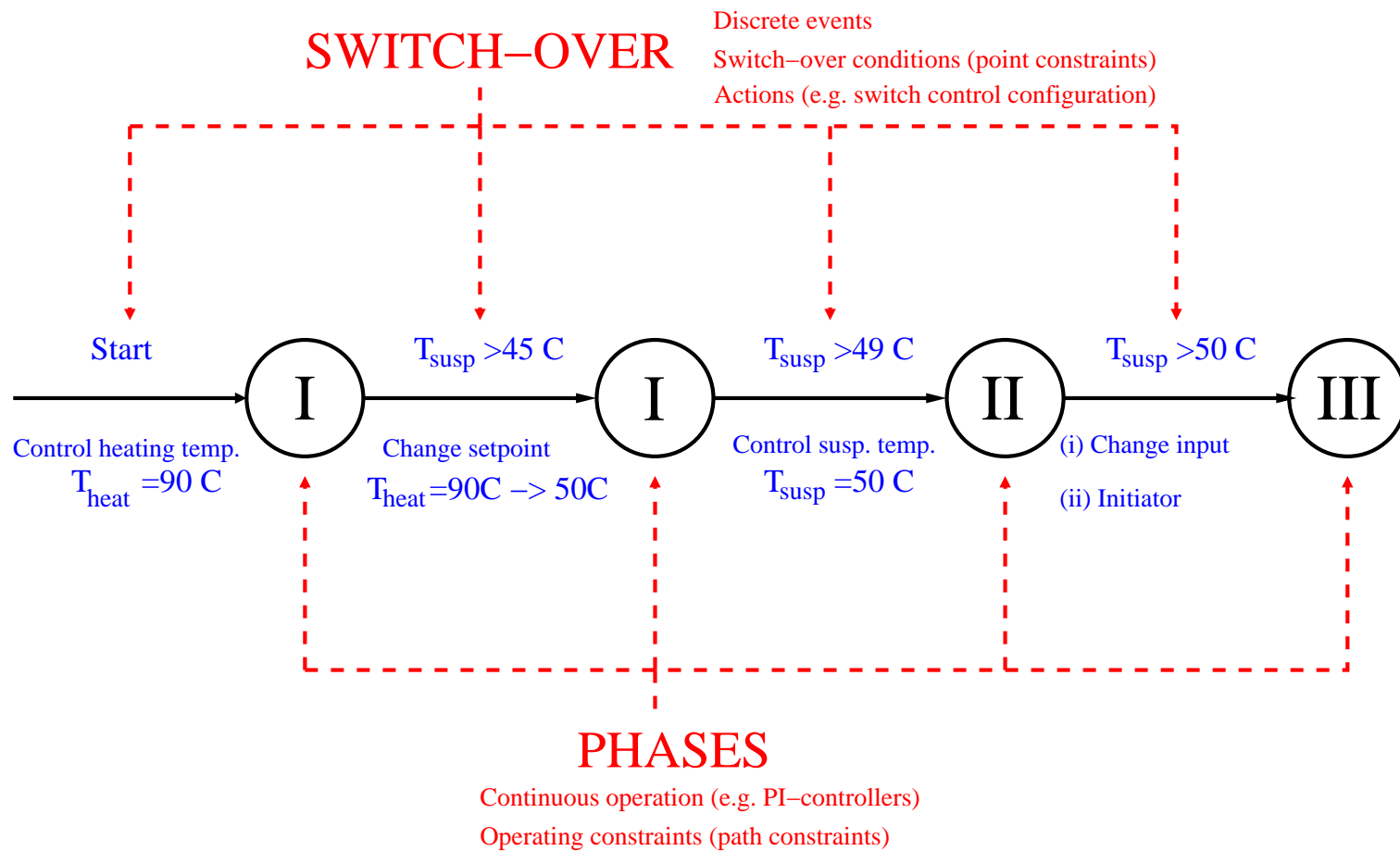
Design procedures:

- Trial and error
- Stephanopoulos and coworkers

Handling procedures:

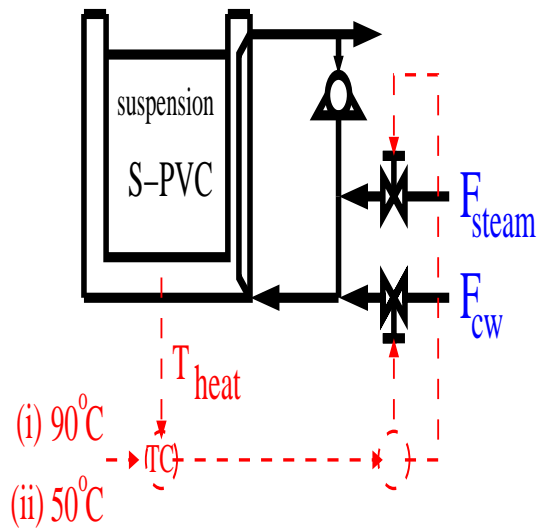
- Operators
- Automation
  - Fuzzy logic control (Bahar *et al.* 1994)
  - Discrete event system (Klein *et al.* 2000)

# Startup: Operating procedure

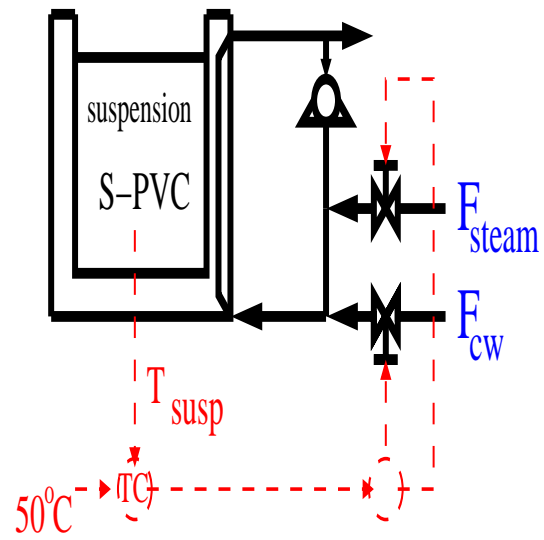


# Varying control structures during startup

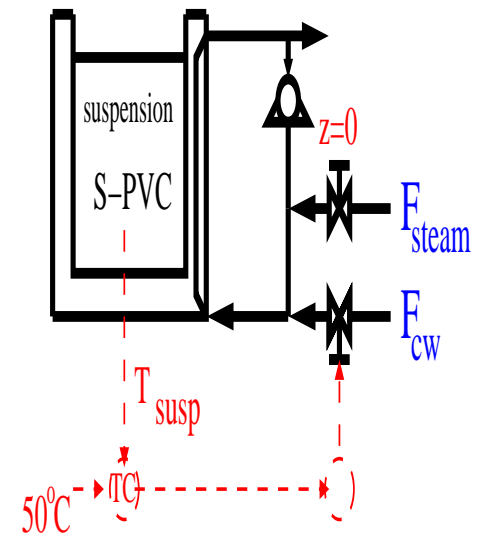
Structure I



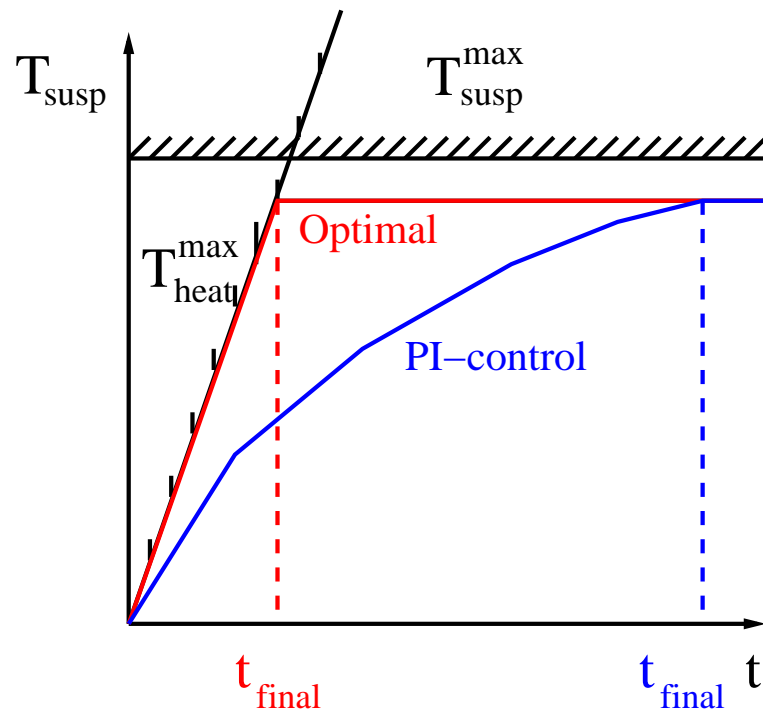
Structure II



Structure III



# Startup: PI-control with target setpoints



Slow control:

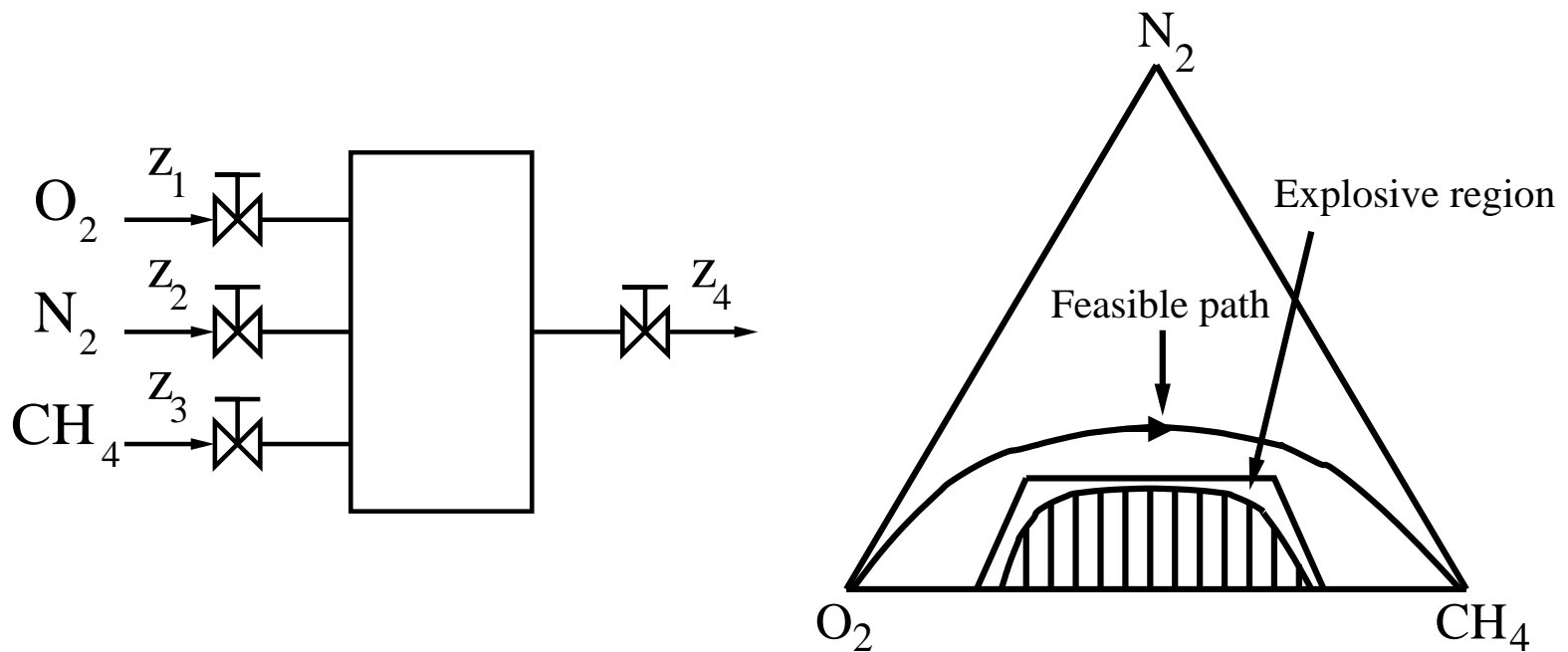
- Path constraints
- Nonlinearities

Phillips *et al.* (1988a), Wozny and Li (2003): "Conventional approach"



# Startup: PI-control with target setpoints

Tank changeover problem (Rivas and Rudd 1974): Infeasible



## Dynamic optimization

$$\min_{u(t), \dot{x}(t), x(t), t_f} \phi(x(t_f), u(t_f), d(t_f), t_f) + \int_0^{t_f} L(x(t), u(t), d(t), t) dt$$

$$\begin{array}{ll} \text{plant :} & f(\dot{x}(t), x(t), u(t), d(t), t) = 0 \quad \forall t \in [0, t_f] \\ \text{path constraints :} & g(\dot{x}(t), x(t), u(t), d(t), t) \leq 0 \quad \forall t \in [0, t_f] \\ \text{position constraints :} & k_p(\dot{x}(t_p), x(t_p), u(t_p), d(t_p), t_p) \leq 0 \quad \forall p \in \{1, \dots, n_p\} \\ \text{disturbances :} & d(t) = d_0(t) \quad \forall t \in [0, t_f] \end{array}$$

Gives:

Optimal profile  $u(t)$ .

Cervantes *et al.* (2002): polyethylene plant

## **Modeling**

Discrete events

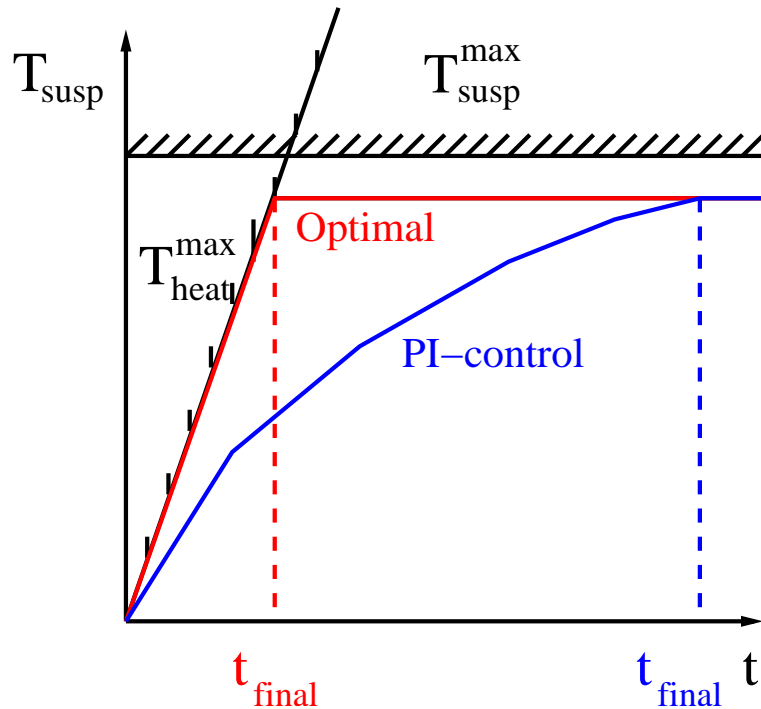
Jumps

Ref: Barton *et al.* (1998)

## **Dynamic optimization methods**

Ref: Biegler *et al.* (2002), Barton *et al.* (1998).

# Startup: Dynamic optimization (offline)



Sensitive to uncertainty

- Disturbances:
  - Initial states
  - Final states
  - Parameters
- Implementation error
  - Measurement errors
- Model error

Reduce sensitivity by feedback:

1. regularly update model and re-optimize
2. change implemented variables (controlled variables)

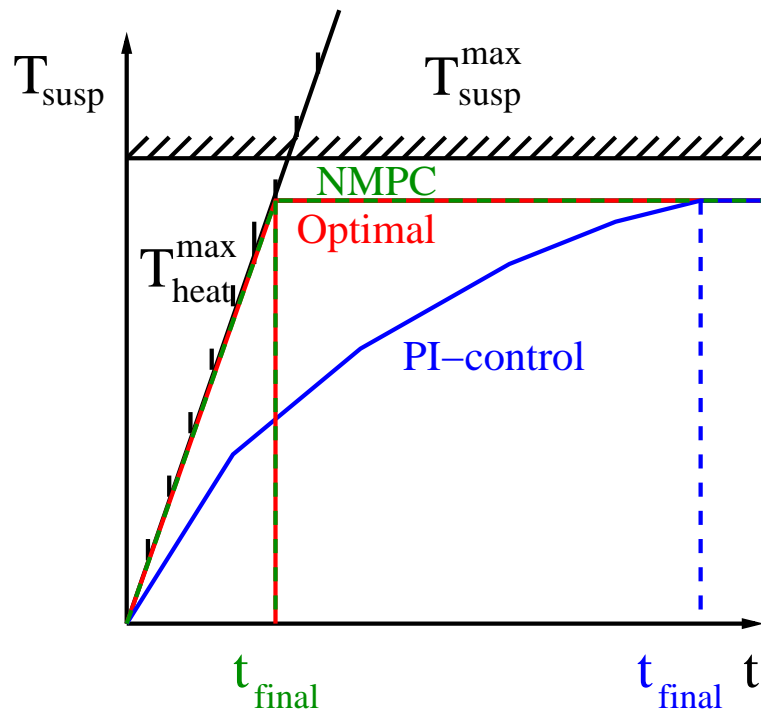
## Nonlinear model predictive control (NMPC)

$$\min_{u_k, x_k, y_k} \sum_{k=1}^p (y_k - y_{s,k})^T Q_{y,k} (y_k - y_{s,k}) + \sum_{k=1}^m (u_k - u_{r,k})^T Q_{u,k} (u_k - u_{r,k})$$

$$\begin{array}{ll} \text{plant :} & f_k(x_{k+1}, x_k, u_k, d_k) = 0 \quad \forall k \in \{1, \dots, p\} \\ \text{outputs :} & y_k = g_k(x_k, u_k, d_k) \quad \forall k \in \{1, \dots, m\} \\ \text{input constraints :} & u_{max} \leq u_k \leq u_{min} \quad \forall k \in \{1, \dots, m\} \\ \text{state constraints :} & x_{max} \leq x_k \leq x_{min} \quad \forall k \in \{1, \dots, s\} \\ \text{output constraints :} & y_{max} \leq y_k \leq y_{min} \quad \forall k \in \{1, \dots, p\} \end{array}$$

Ref: Biegler (1998), Santos *et al.* (2001)

# Startup: Nonlinear model predictive control (NMPC)



Advantages:

- Feasibility
- Nonlinearity

Disadvantages:

- Modeling
- Computation online
- Objective function?

## Self-optimizing control for dynamic system (ideal)

$$\min_{c(..), c_s(t), u(t), \dot{x}(t), x(t), t_f} \phi(x(t_f), u(t_f), d(t_f), t_f) + \int_0^{t_f} L(x(t), u(t), d(t), t) dt$$

<i>plant :</i>	$f(\dot{x}(t), x(t), u(t), d(t), t) = 0$	$\forall t \in [0, t_f]$
<i>path constraints</i>	$g(\dot{x}(t), x(t), u(t), d(t), t) \leq 0$	$\forall t \in [0, t_f]$
<i>controlled variables</i>	$c(\dot{x}(t), x(t), u(t), d(t), t) = c_s(t) + d_c(t)$	$\forall t \in [0, t_f]$
<i>disturbances</i>	$d(t) = d_0(t) + \Delta d(t)$	$\forall t \in [0, t_f]$
<i>impl. errors</i>	$d_c(t) = d_{c,0}(t) + \Delta d_c(t)$	$\forall t \in [0, t_f]$

Find: Controlled variables  $c(\dot{x}(t), x(t), u(t), d(t), t)$  and corresponding setpoint  $c_s(t)$

Implement:

Operating policy: Less sensitive to uncertainty (i.e. more robust operation)

# "Self-optimizing control" for dynamic system

Main issue: Identify:

- Controlled variables with setpoints
- Switching conditions.

"Method":

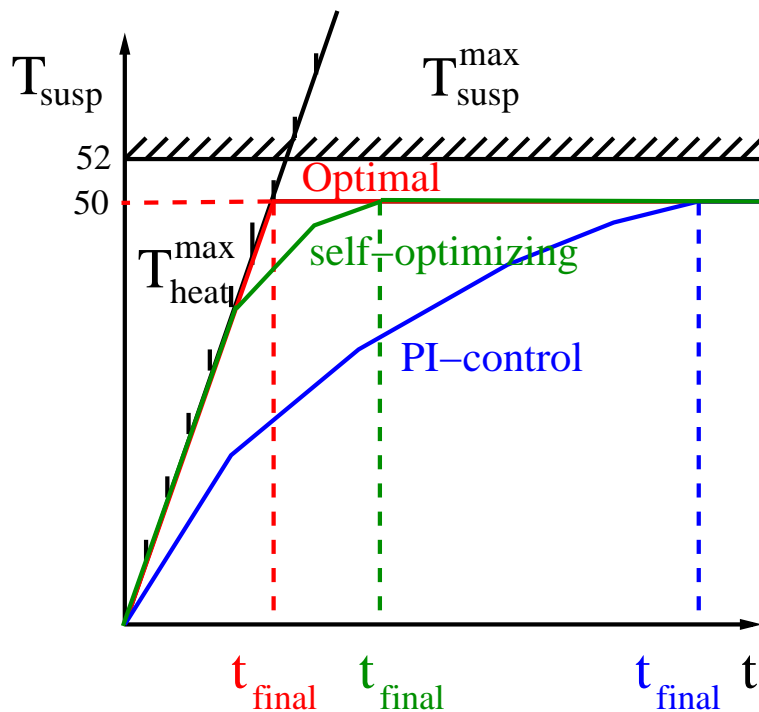
- Dynamic optimization - nominal and expected uncertainty
- Initial controlled variables and setpoints:
  - Active constraints
  - Nominal setpoints (afo time)
- Show loss as function of time
  - Regions with large loss
- Simplify operating policy
  - Profile → constant setpoints

Ref: Bonvin and coworkers



# Startup: Self-optimizing control

In practice: A robust operating policy (procedure)



Advantages:

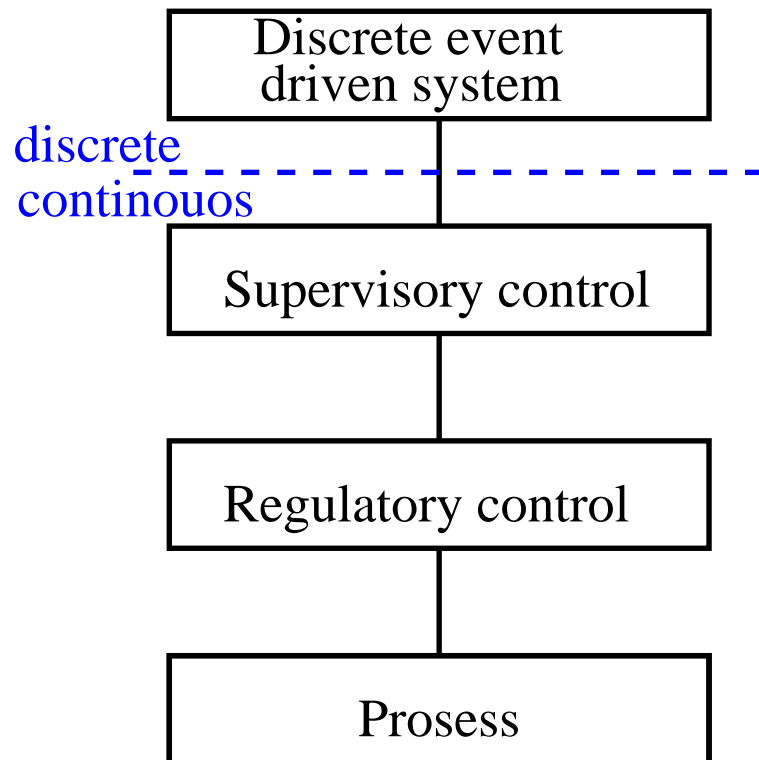
- Simple and close to optimal operation
- Less sensitive to uncertainties
- Reduced online computation

Disadvantages:

- Identify  $c$
- Modeling and model uncertainty
- Offline computations

Handling extreme uncertainties → safety system.

## Interesting research areas



- Operating procedure
- Dominating phases (e.g. semi-continuous phase in distillation column).
- Dominating subprocess (e.g. reactor or columns.)
- Discrete event driven system

## Concluding remarks

- Open
- Complex
- Challenging
- Safety
- Piece-wise self-optimizing dynamic control

## Comments

Consider "bottlenecks" with respect to startup time or cost:

- Parts in a startup procedure, e.g. dominating phases (e.g. semi-continuous phase in distillation column startup).
- Part of the process, e.g. reactor or distillation column.

Discrete event driven system

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