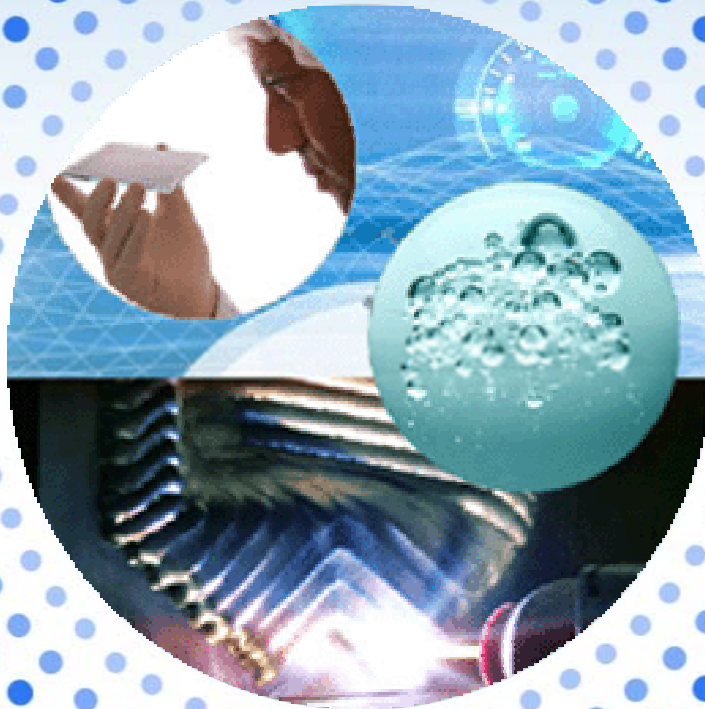


Optimization of CC & HPV power plants with HD-MPC



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HD-MPC Workshop, Leuven, 24/06/2011





Agenda

□ Introduction

- ✓ New Challenges for power generation
- ✓ Motivation for HD-MPC solution

□ Optimal control of CC & HPV Operation

- ✓ Process Description & Control Objectives
- ✓ HD-MPC solutions
- ✓ Results

□ Conclusion , Lessons Learned

Introduction

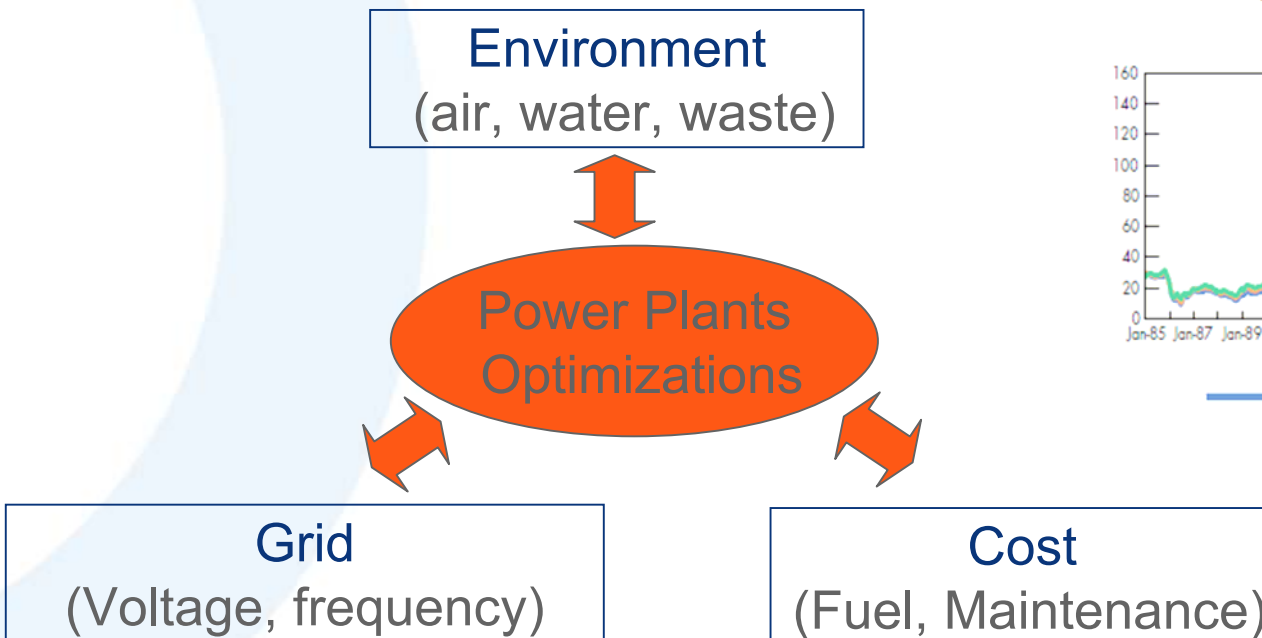
- ✓ Driving factors for Power Plant Optimization
- ✓ Grid requirements
- ✓ HD-MPC solutions for power plant optimization



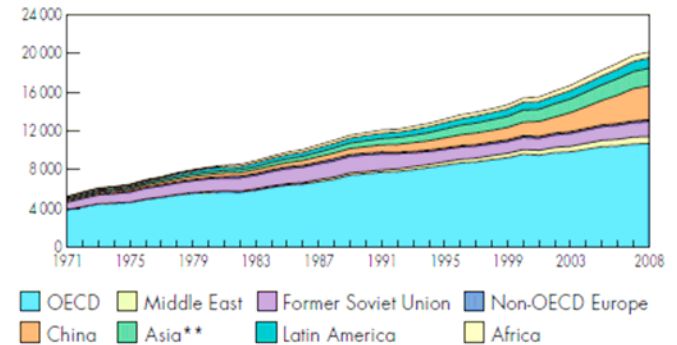


Drivers for Power Plant Optimization

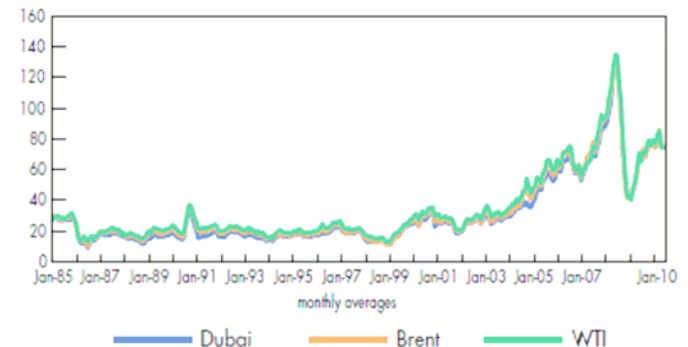
- ✓ World Demand Electricity Increases
- ✓ Raw Material Prices Increases
- ✓ Climate Changes
- ✓ Electricity Market Liberalization
- ✓ Grid Stability



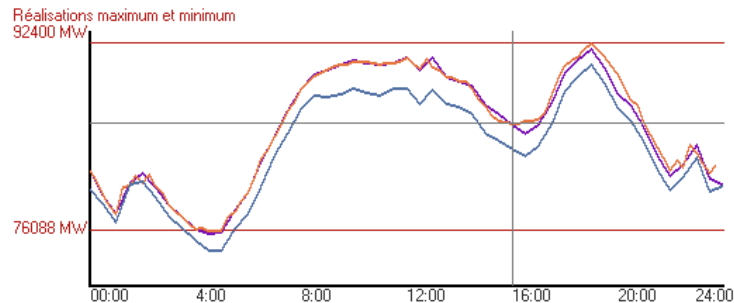
Evolution from 1971 to 2008 of world electricity generation* by region (TWh)



Key crude oil spot prices in USD/barrel



Ex: Grid Requirements. (UCTE)



Caractéristiques

Date des données : 07/01/2009
Consommation minimum : 76088 MW
Consommation maximum : 92400 MW

Valeurs instantanées

Heure : 16:00
Consommation : 85396 MW
Prévision initiale J-1 : 83200 MW
Prévision estimée J : 85300 MW

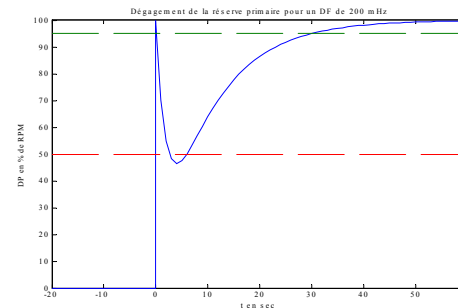
Date des informations : 07/01/2009

$$P = P_0 + k \Delta F + N pr$$

Active Power Set-point :

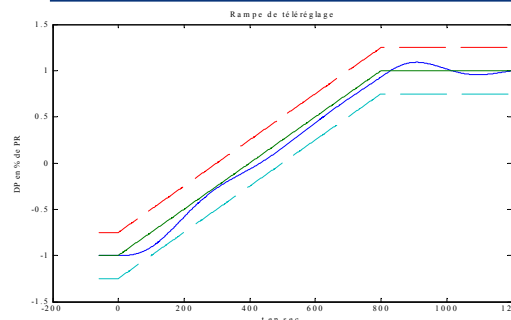
P_0 : Daily program

$k \Delta F$: Primary. freq. response



100 % in 30s.

$N Pr$: Secondary . freq. response



$2*Pr$ in 800 s





HD-MPC for Power Plant optimization

Goal : Find new solutions for Power Plant Operations adapted to :

- ❑ Large Interconnected Systems
- ❑ Multiple objectives
- ❑ Non linear dynamics
- ❑ Different Time Scales



Hydro Power Valley

- ✓ Process Description & Control Objectives
- ✓ Modeling & HD-MPC solutions
- ✓ Results



Process & Control Description

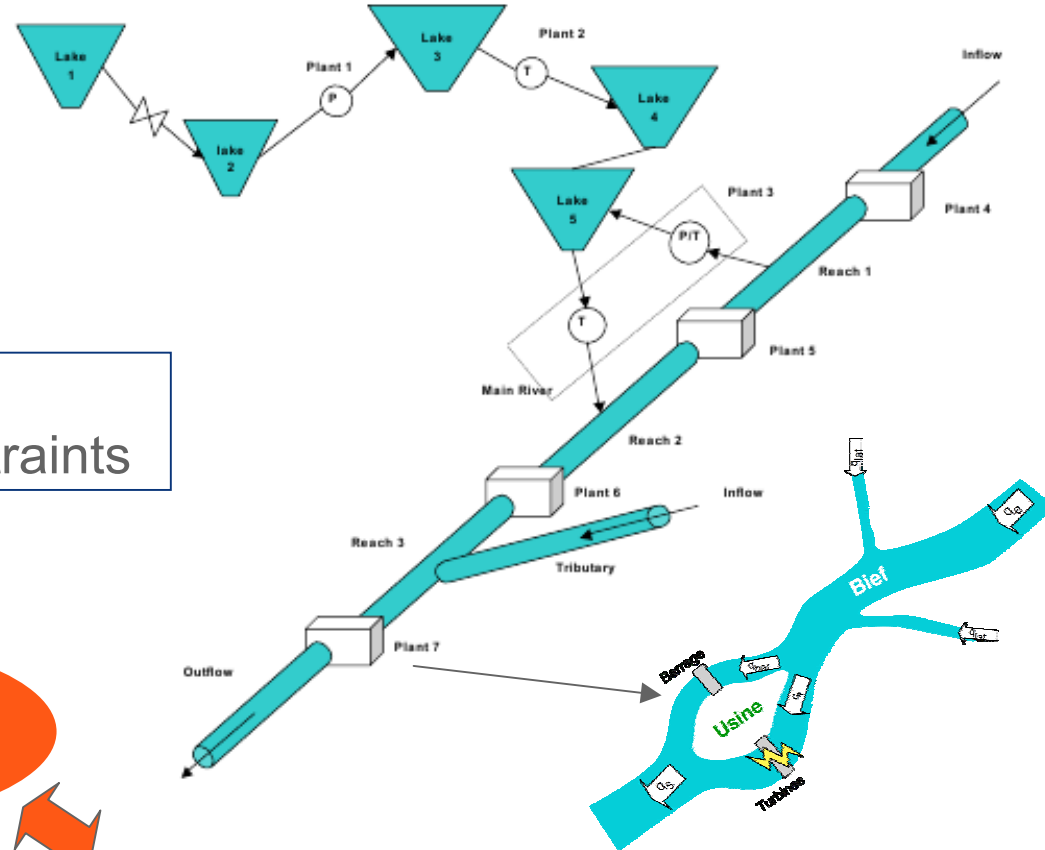
- ✓ 4 run-of-river power plants
- ✓ 5 Reservoirs

Environment
Level, flow rate constraints

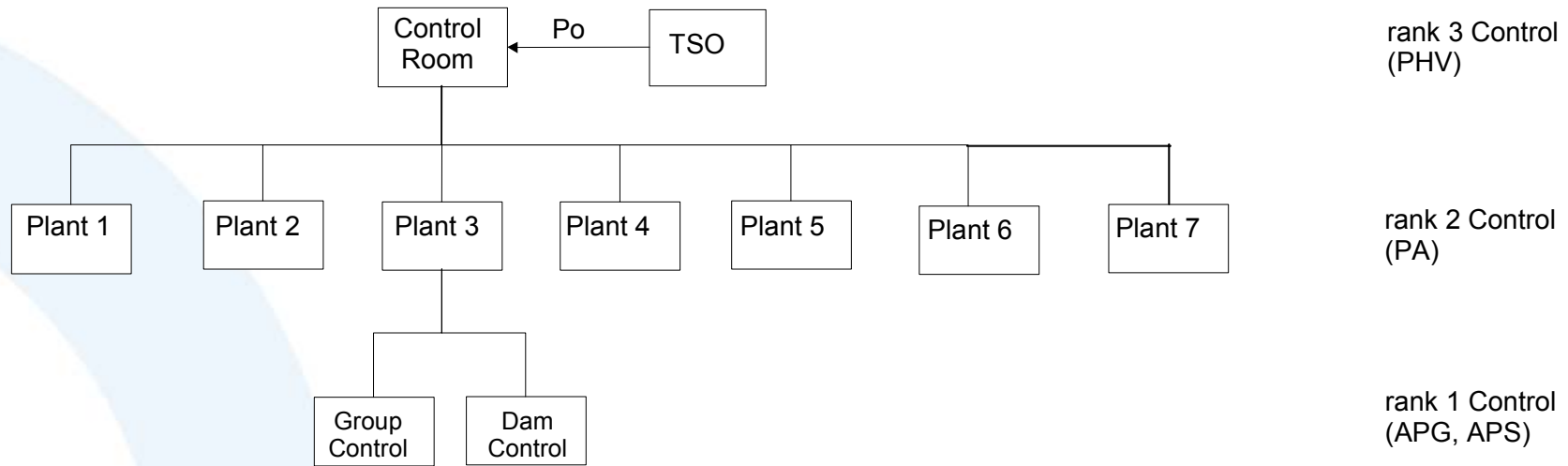
HPV
Optimizations

Grid
 $P_o + kDf + NPr$

Cost
(Limited Storage)



Process & Control Description



- Rank 3 : Alert, Supervision, Dispatching, Valley Control Room, Communication with TSO
- Rank 2 : Level/flow control, Machine Commitment, RSFP, RSFT
- Rank 1 : Safety functions, group start-up & shutdown

Modeling of a River Reach

x : longitudinal coordinate [m]

t : time [s]

$S(x,t)$: wetted section [m²]

$P(x,t)$: wetted perimeter [m]

$Q(x,t)$: volumetric flow [m³/s]

q_{lat} : lateral inflow per unit length [m²/s]

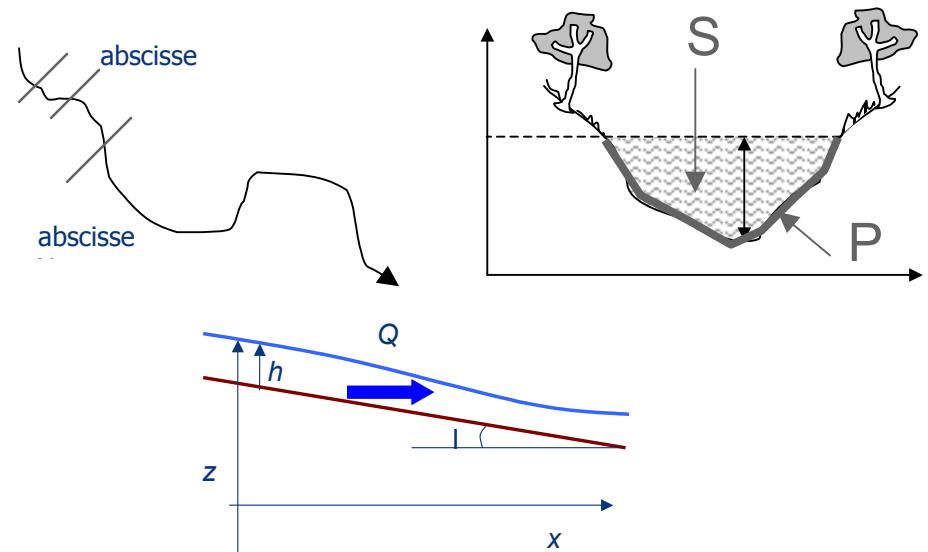
$z(x,t)$: height [m]

K : Strickler Coefficient [SI]

k : lateral inflow coefficient

Mass Conservation equation

$$\frac{\partial S}{\partial t} + \frac{\partial Q}{\partial x} = q_{lat}$$



Momentum conservation equation

$$\frac{\partial Q}{\partial t} + \frac{\partial}{\partial x} \left(\frac{Q^2}{S} \right) + gS \left(\frac{\partial z}{\partial x} + J \right) = k \cdot q_{lat} \cdot v$$

$$J = \frac{Q|Q|}{S^2 R_h^{4/3} K^2} \quad R_h = \frac{S(x,t)}{P(x,t)}$$

Control Models

Spatial Discretisation of Saint-Venant Equations

$$\left\{ \begin{array}{l} \frac{\partial h_1}{\partial t} = -\frac{1}{w_1} \cdot \frac{q_1 - q_e - q_{lat1}}{dx} \\ \frac{\partial q_1}{\partial t} = -\frac{2q_1}{w_1 h_1} \cdot \frac{q_1 - q_e}{dx} + \left[\frac{1}{w_1} \left(\frac{q_1}{w_1} \right)^2 - g w_1 h_1 \right] \cdot \frac{h_2 - h_1}{dx} + \\ g w_1 S_b h_1 - \frac{g w_1 h_1}{k_{str}^2} \cdot \left(\frac{w_1 + 2h_1}{w_1 h_1} \right)^{4/3} \cdot \left(\frac{q_1}{w_1 h_1} \right)^2 \end{array} \right.$$

$$\left\{ \begin{array}{l} \frac{\partial h_i}{\partial t} = -\frac{1}{w_i} \cdot \frac{q_i - q_{i-1} - q_{lat_i}}{dx} \\ \frac{\partial q_i}{\partial t} = -\frac{2q_i}{w_i h_i} \cdot \frac{q_i - q_{i-1}}{dx} + \left[\frac{1}{w_i} \left(\frac{q_i}{w_i} \right)^2 - g w_i h_i \right] \cdot \frac{h_{i+1} - h_i}{dx} + \\ g w_i S_b h_i - \frac{g w_i h_i}{k_{str}^2} \cdot \left(\frac{w_i + 2h_i}{w_i h_i} \right)^{4/3} \cdot \left(\frac{q_i}{w_i h_i} \right)^2 \end{array} \right.$$

$$\frac{\partial h_{N+1}}{\partial t} = -\frac{1}{w_{N+1}} \cdot \frac{q_s - q_N}{dx}$$

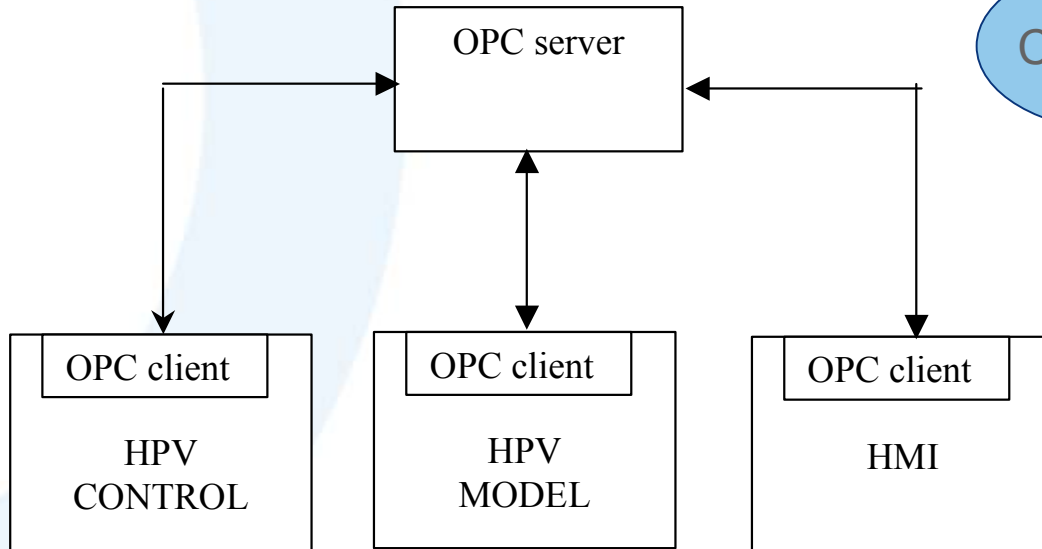
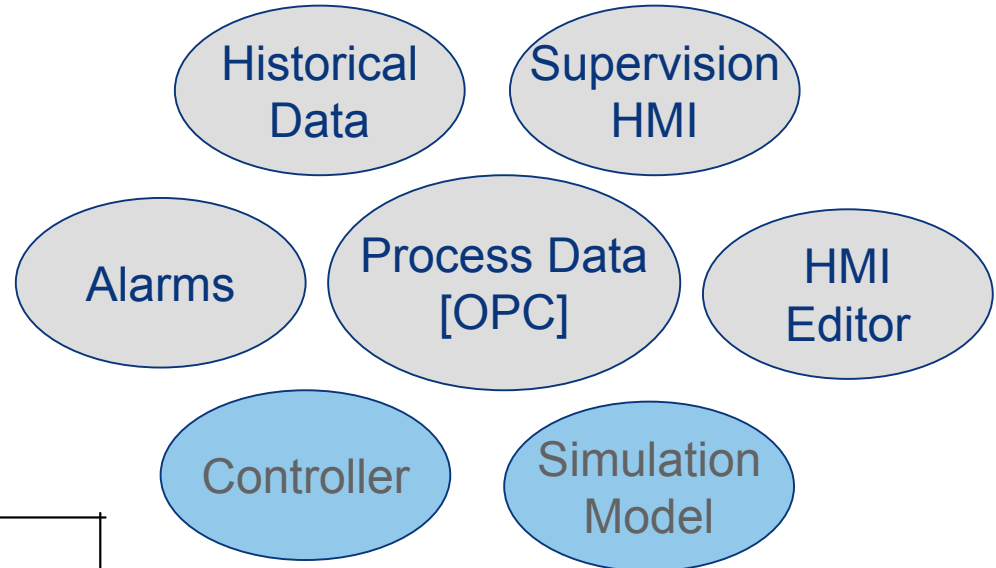


Simulation platform



Platform made of :

- OPC server
- HMI (editor and supervisor)
- Alarms
- Archived data measurements
- Matlab + OPC Toolbox





HD-MPC solutions

Methods are under development

- 1) Centralized MPC controller – Reference
- 2) Two level Hierarchical MPC solution
- 3) Sensitivity-driven Gradient method (RWTH)
- 4) Multiple shooting Method (KUL)
- 5) Game theory (USE, UNC)
- 6) ...

2-Level MPC solution

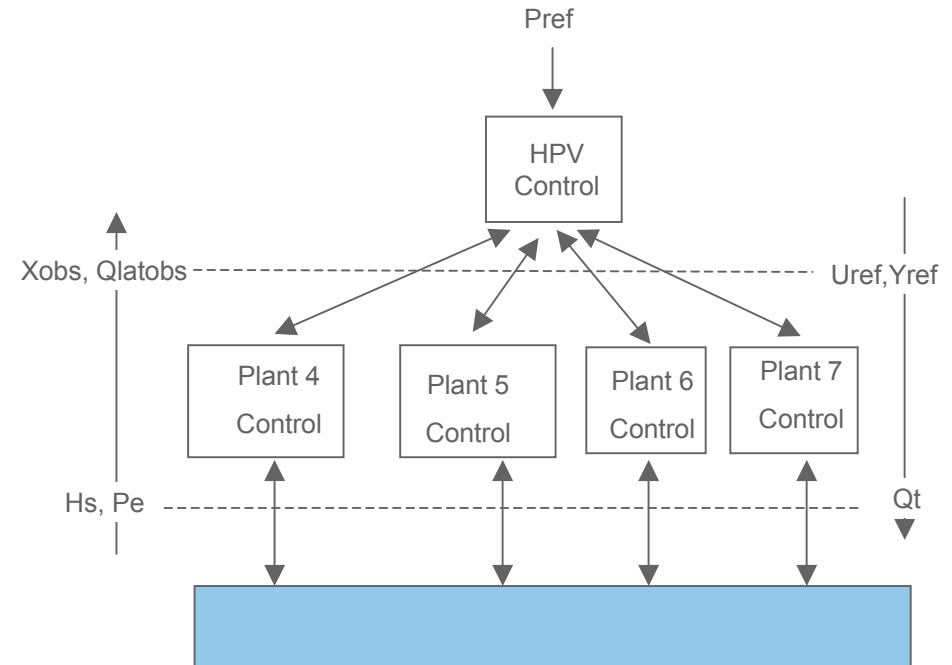
Upper Level

$$J_{sup}[k] = \sum_{i=0}^{N_h^{sup}} (p_e[k+i] - p_{e\ ref}[k+i])^2$$

$$\underline{q_{t\ bief}} < q_{t\ bief} < \overline{q_{t\ bief}}$$

$$\underline{h_{s\ bief}} < h_{s\ bief} < \overline{h_{s\ bief}}$$

$$|q_t[k+1] - q_t[k]| < \overline{\Delta q_t}$$



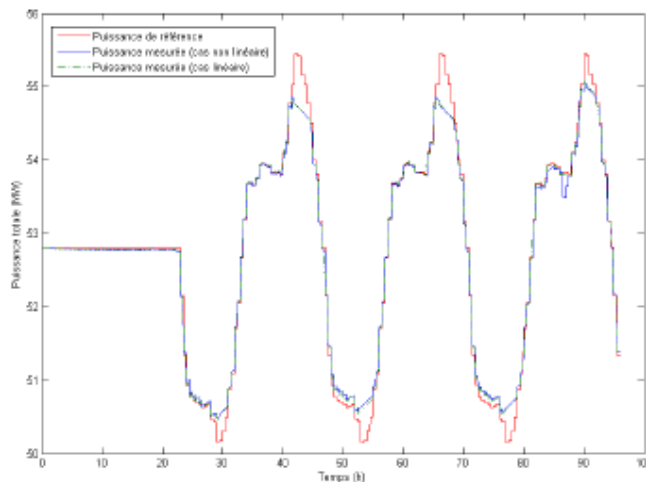
Lower Level

$$J_{inf}[k] = \sum_{i=0}^{N_h^{inf}} \left\| u[k+i] - u_{ref}[k+i] \right\|_R + \left\| y[k+i] - y_{ref}[k+i] \right\|_Q$$

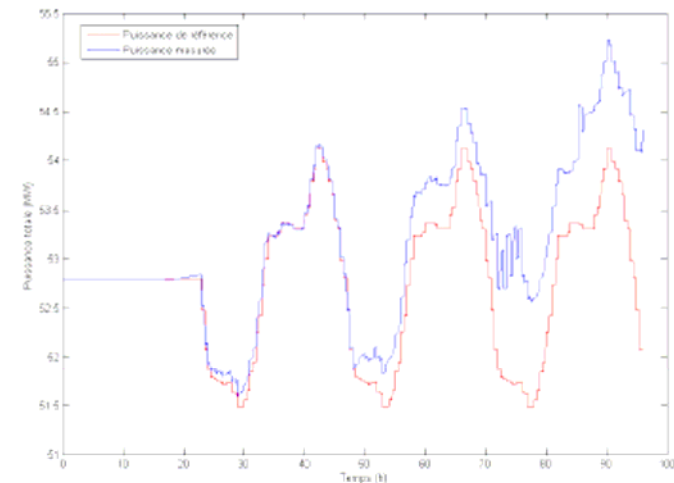
Results (Two level hierarchical MPC)

- Perturbation is correctly rejected when no constraints are active.
- Control performance decreases when constraints are active.

Load following



Load following with perturbation





Combined Cycle Start-up

- ✓ Process Description & Control Objectives
- ✓ Modeling & HD-MPC solutions
- ✓ Results



Process Description & Control

1 GT- 1 HRSG - 1ST

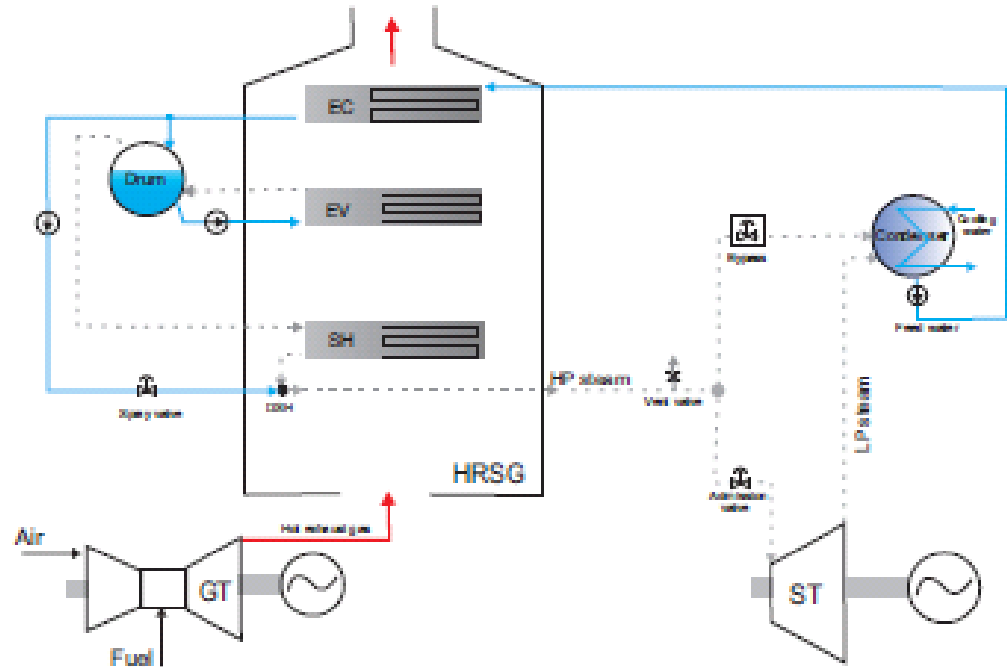
1 Pressure Level

Environment
NO_x, CO₂

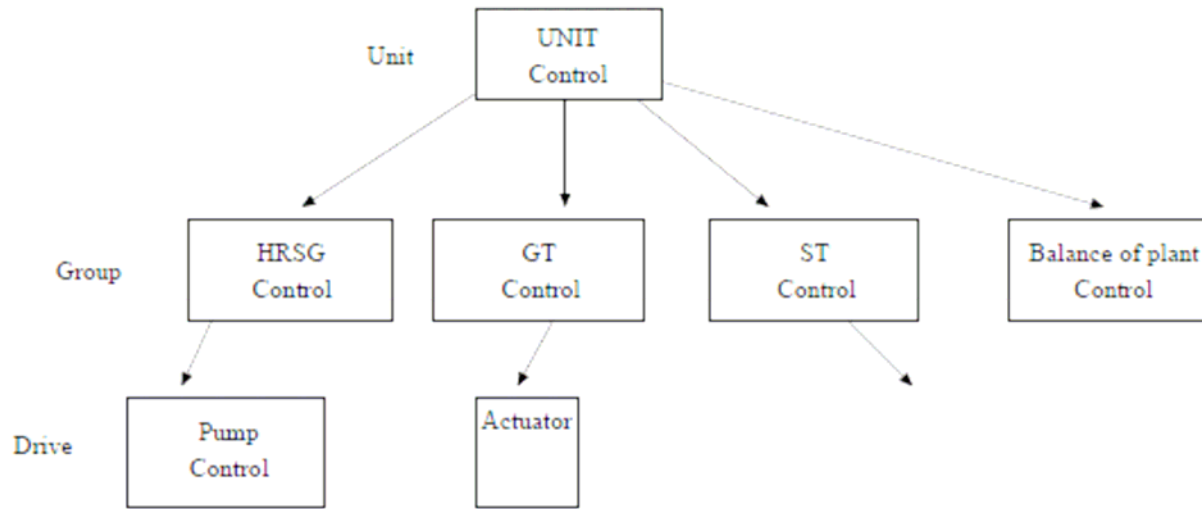
CC SU
Optimizations

Grid
Startup Time

Cost
Fuel, Water, Life
Consumption



Process & Control Description



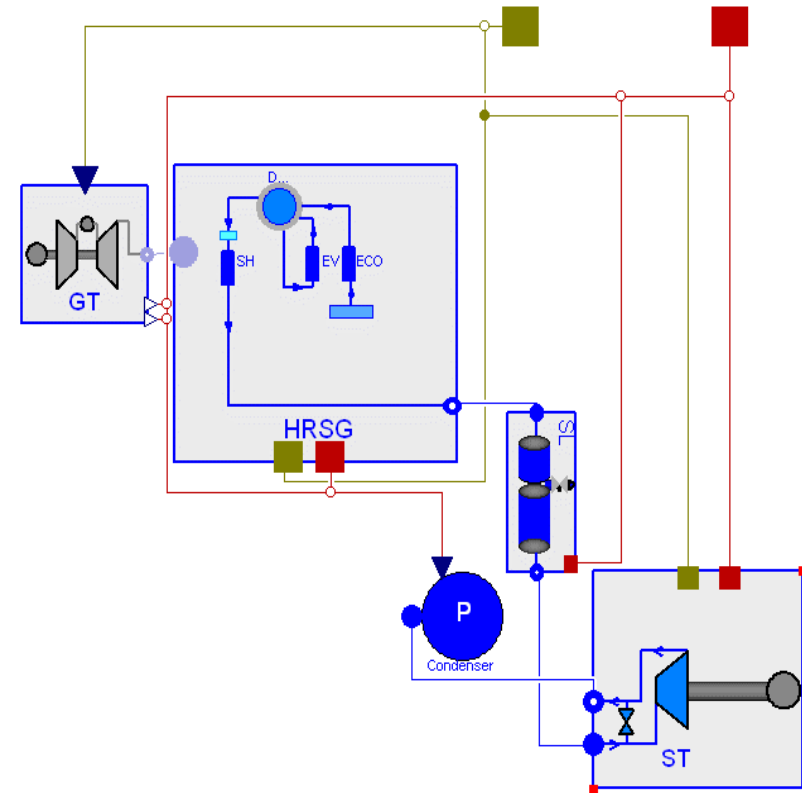
- Unit : General Sequence & Control
- Group : Sequence & Control Subsystem (Feedwater, Fuel,)
- Rank 1 : Sequence & Control of components (Pump, ...)

CCPP modeling: Modelica

- ❑ CCPP model:
 - ✓ developed in Modelica language
 - ✓ using Modelica simulation environment, Dymola
- ❑ Modelica: modeling language for large, complex and heterogeneous physical systems:
 - ✓ Free language
 - ✓ Object-oriented
 - ✓ Equation based
 - ✓ Multi-domain

CCPP model - Dymola

- ❑ 1-1-1 configuration (GT-HRSG-ST)
- ❑ One single level of pressure (HP)
- ❑ Equations derived from first principles (mass, energy and momentum balances)
- ❑ Model complex: ~ 1500 equations
- ❑ Validated against experimental data
- ❑ Includes a model of thermal and mechanical stress in critical components (superheated steam header and ST rotor)
- ❑ Smooth model have been developed for optimization



CCPP - Plant inputs/outputs

Inputs:

- **load of GT**
- feed water flow rate for the HRSG circuit
- water flow feeding the desuperheater
- position of bypass valve
- position of throttle valve
- generator grid breaker of the steam turbine

Outputs:

- power of GT
- fuel flow in GT
- drum level
- temperature of steam in the superheater
- steam flow
- header stress
- temperature of steam in the SL
- power of ST
- frequency of ST
- rotor stress of ST

GT Load profile –Optimization

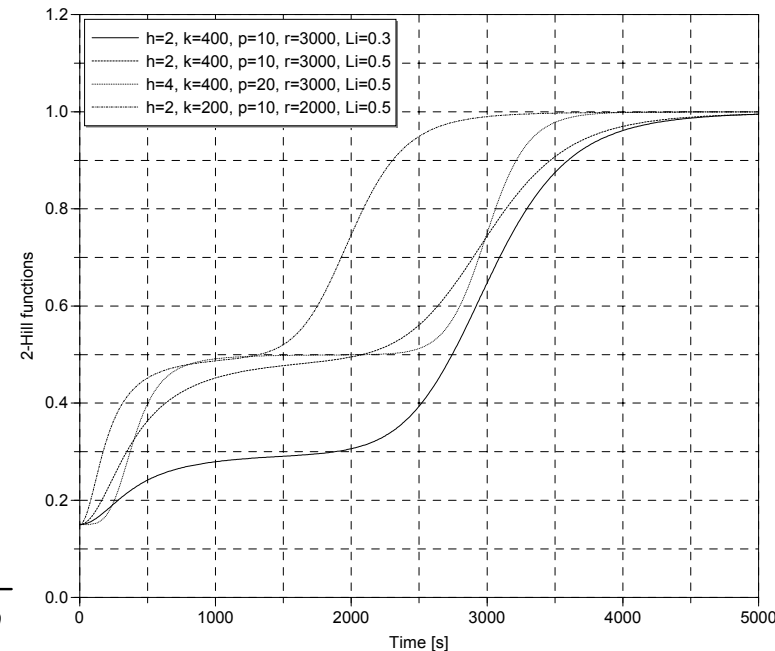
CCPP non-linear model: $\dot{x}(t) = f(x(t), u, L(t))$

- x = model states (temperatures, pressures, enthalpy...)
- u = model inputs (feed water, feed DSH...)
- L = GT load
 - ✓ initial load $L(t_0) = L_m$
 - ✓ full load $L(t_f) = L_M$

- Assumption:
GT Load is a parameterized function:
 $L(t, q)$ sum of 2 Hill functions

$$L(t, q) = L_m + (L_i - L_m) \frac{t^h}{t^h + k^h} + (L_M - L_i) \frac{t^p}{t^p + r^p}$$

$$q = [h, k, p, r, L_i]$$



GT Load profile optimization

- Minimum time problem definition:

$$\min_{q, t_f} J = \int_{t_0}^{t_f} dt$$

Parameters to be optimized:

$$t_f, q=[h,k,p,r,Li]$$

- subject to the constraints:

$$\dot{x}(t) = f(x(t), u, L(t, q))$$

$$L(t_f, q) \geq L_M - \varepsilon_1$$

$$|f(x(t_f), u, L(t_f, q))| \leq \varepsilon_2$$

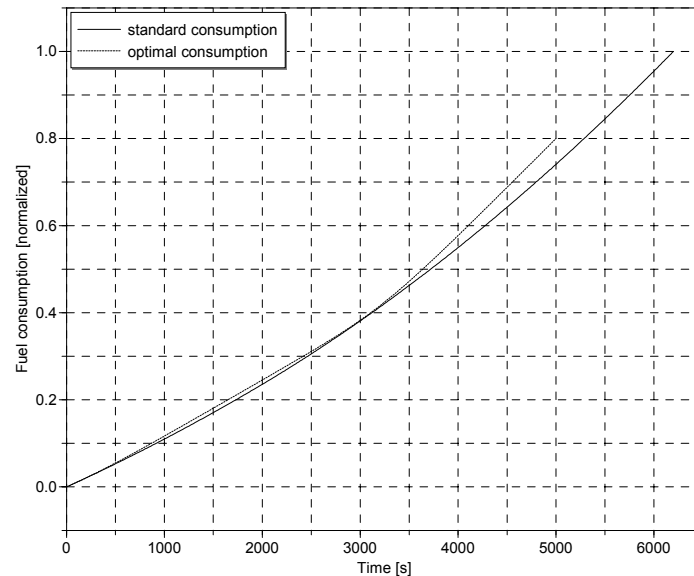
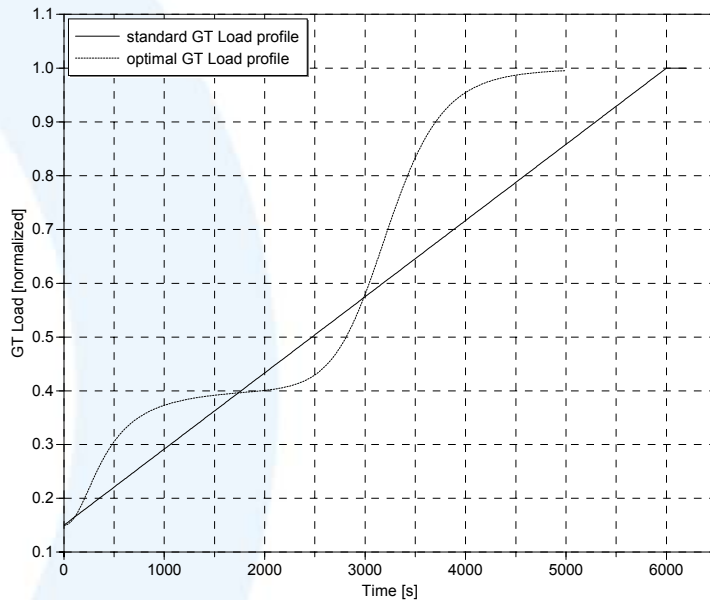
$$h(x(t)) \leq 0, \quad t_0 \leq t \leq t_f$$

constraints on the state variables (temperatures, pressures, stresses)



Optimization Results

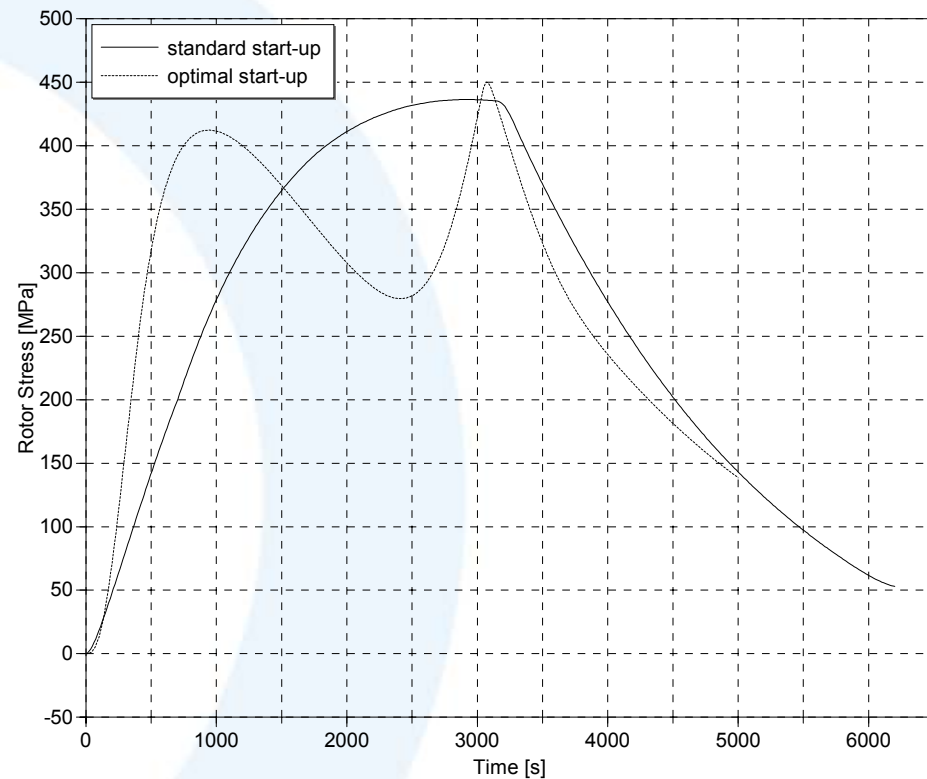
- Optimal start-up is 20 minutes faster than a classical start-up (with a constant GT load ramp rate satisfying the stress limit)



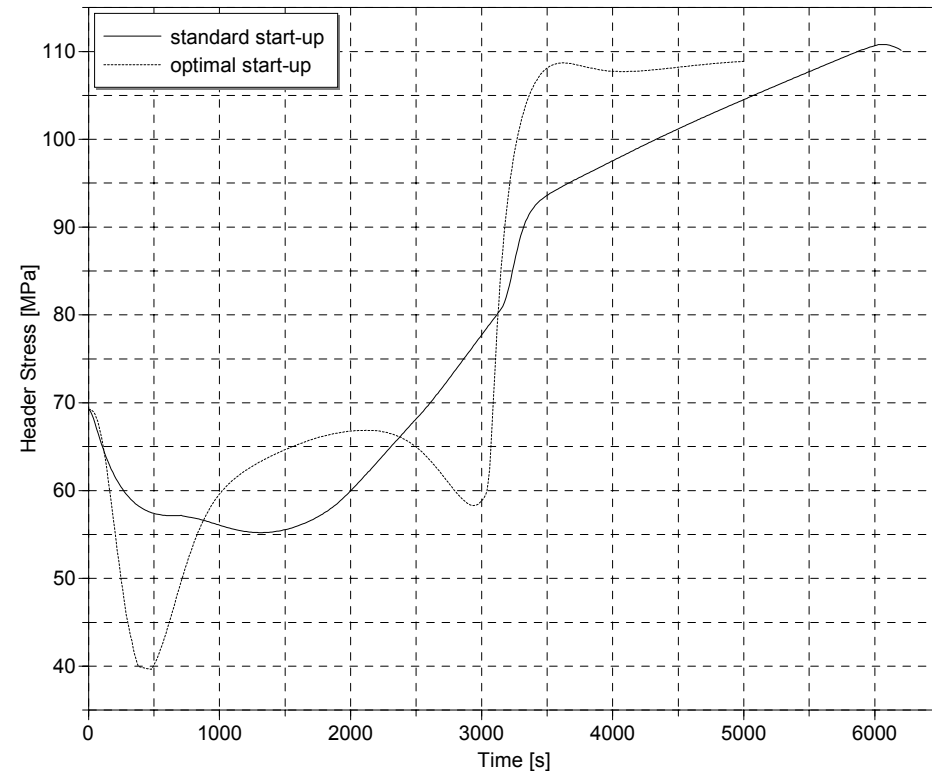
⇒ reduction of the operating costs due to lower fuel consumption ($\approx 20\%$)

Optimization Results

- Rotor stress:



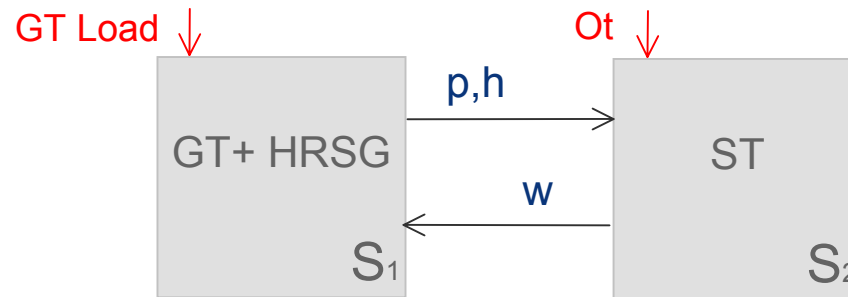
- Header stress:





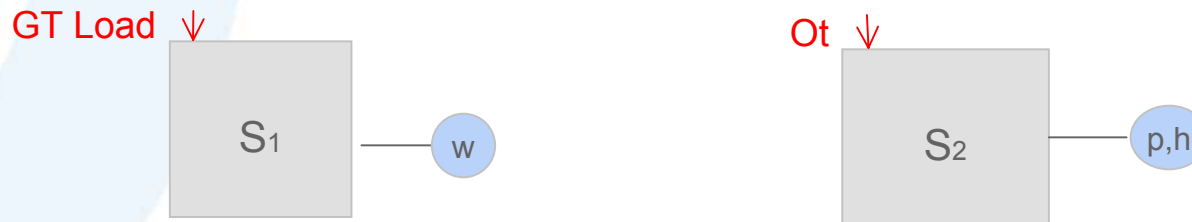
Distributed Approach

□ Model decomposition



□ 2 profiles optimization (GT Load, Ot)

□ Physical decomposition: 2 Dymola models





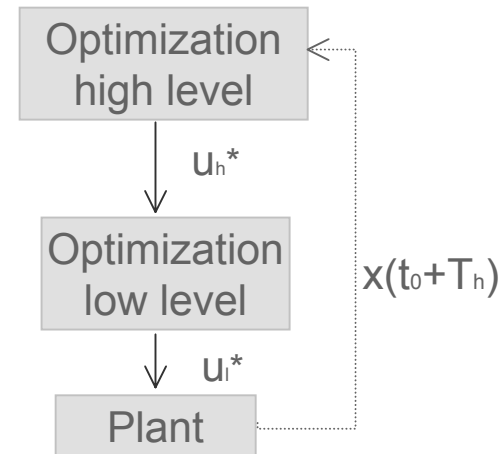
Hierarchical Approach

□ High level:

- Minimal time:
$$\min_{q, t_f} J = \int_{t_0}^{t_f} dt$$

- $u_h^* = L_1(q, t)$

- T_h – HL sample time



□ Low level:

- Quadratic:
$$\min_{u(q, t)} J = \int_{t_0}^{t_0 + T_h} (u(q, t) - u_h^*(q, t_0 + T_c))^2 dt$$

- $u_l^* = L_2(q, t), \quad T_c \geq T_h$

- T_l – LL sample time

Summary

- ❑ A Modelica model based on the ThermoPower library is developed and used for start-up optimization
- ❑ The start-up optimization method is based on parameterized functions
- ❑ This approach is used to minimize the start-up time, while keeping the constraints within their limits
- ❑ The idea of solving the start-up problem by optimizing a parameterized function can be expanded in many ways (e.g. by considering other types of functions, by using as optimization signals other model inputs (ST throttle)
- ❑ Further work: use this optimization procedure in hierarchical and distributed feedback control algorithms (HD-MPC)

General conclusion & lessons learned

- ❑ Solutions are still under development,
- ❑ HD-MPC solutions can be applied naturally in the HPV case.
- ❑ HD-MPC Optimization with Modelica CCPP models is difficult.
 - ✓ Library developed for simulation are not suited for optimization (discontinuities)
 - ✓ Initialization problems with Dymola
 - ✓ Analytical Jacobian is not available for complex Dymola models
 - ✓ Unfeasible simulation occurs (water-steam table)

