

# Integrated System Identification and PID Controller Tuning by Frequency Loop-Shaping

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# Outline

- **Problem Description:** PID Tuning from Input-Output data
- **System Identification and Estimation of Uncertainty Bounds**
  - Additive/Multiplicative Uncertainty
  - Coprime Factor Uncertainty
- **Target Loop Selection and PID Tuning**
  - 1st, 2nd order targets
  - Convex optimization to solve a special model matching problem
  - Tuning for multiple models
- **Experimental Results**
  - Reactor Bed Temperature Control
  - Fractionator Inlet Header Pressure Control
- **Conclusions**

# Problem Description

- Industrial Applications
  - Reliability and Expediency Requirements
- Modeling from I/O data
  - System Identification
- Uncertainty estimation
  - Target performance determination
- Controller design
  - Specifications in terms of a target loop or target sensitivities
  - “Minimize” sensitivity subject to bandwidth constraints

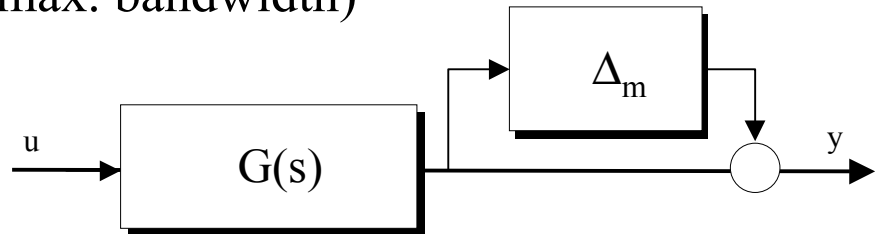
# System Identification

- Identification experiment
  - Steps, PRBS, other
  - Choice of excitation: Good SNR in the frequency range of interest (intended crossover)
- Estimation of nominal model (various approaches)
- Uncertainty bound estimation (different uncertainty structures)
  - Additive/Multiplicative (T-bound, max. bandwidth)
  - Coprime Factors (S+T bounds, concurrent selection of the target loop, simpler targets for PIDs)
  - Guide: Robust Stability Condition

# System Identification (cont.)

- Uncertainty structures
  - Multiplicative (T-bound, max. bandwidth)

$$|T(j\omega)| |\Delta_m(j\omega)| < 1$$



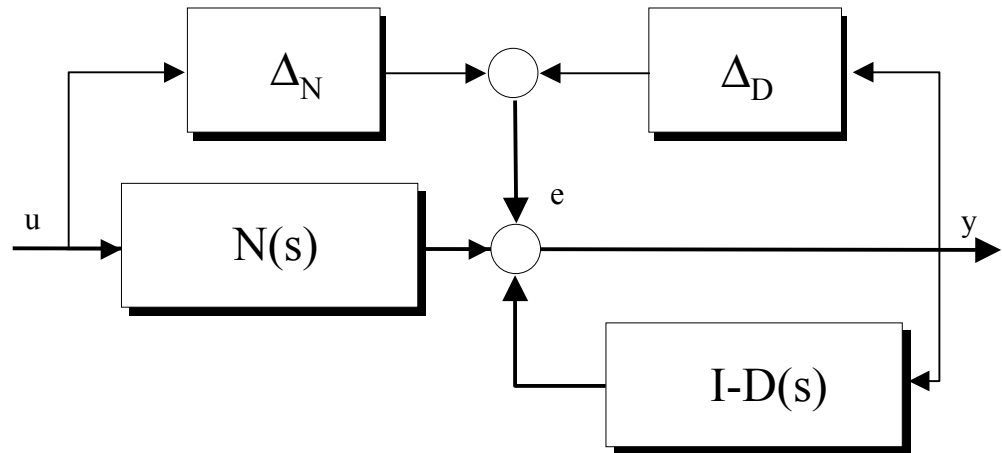
- Coprime Factors (S+T bounds)

$$|G^{-1}TD^{-1}| |\Delta_N| + |SD^{-1}| |\Delta_D| < 1$$

≈

$$|T| |N^{-1}| |\Delta_N| < 1 \quad (\text{hi-freq})$$

$$|S| |D^{-1}| |\Delta_D| < 1 \quad (\text{lo-freq})$$



# Target Loop Selection and PID Tuning

- Typical Targets:  $\frac{\lambda}{s}$ ,  $\frac{\lambda(s+a)}{s^2}$ ,  $\frac{\lambda(s+a)}{s(s+\varepsilon)}$ , ...
  - Target order depends open-loop/closed-loop bandwidth ratio (for input disturbance attenuation)
  - Uncertainty constraints and RHP pole-zero limitations
  - More difficult cases via LQ or full-order controller design methods e.g.,  $K=lqr(A,B,Q,R)$ , target:  $[A,B,K]$
- FLS Tuning: convex optimization in the frequency domain

$$\begin{aligned} \min_{K_{pid}} \left\| S(GC_{K_{pid}} - L) \right\|_{L_\infty} & \quad \min_{K_{pid}} \left\| S(GC_{K_{pid}} - L) \right\|_{L_2} \\ \text{s.t. } K_{pid} \text{ constr.} & \quad \text{s.t. } \left\| S(GC_{K_{pid}} - L) \right\|_{L_\infty} \leq b \\ & \quad K_{pid} \text{ constr.} \end{aligned}$$

# Target Loop Selection and PID Tuning (cont.)

- A Special Case of Interest: Multiple plants
- FLS Tuning with multiple target loops
  - Target loops can be fixed, or
  - Target loop bandwidth can be an argument of the optimization (first order targets)

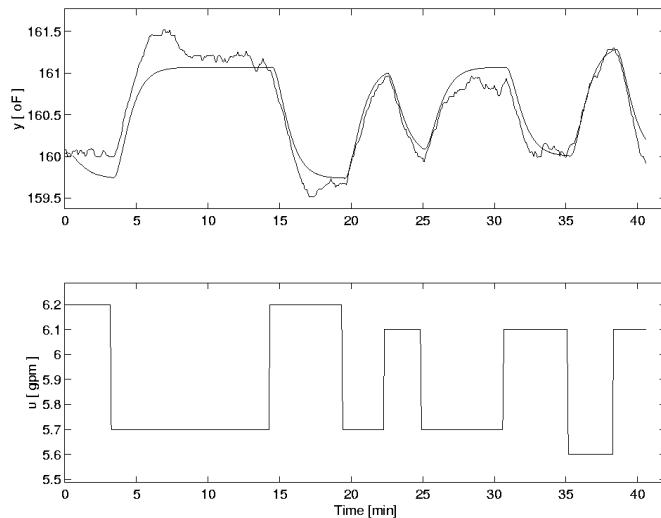
$$\min_{K_{pid}} \left\| \begin{array}{c} S_1 (G_1 C_{K_{pid}} - L_1) \\ \vdots \\ S_m (G_m C_{K_{pid}} - L_m) \end{array} \right\|_{L_\infty}$$

*s.t.*  $K_{pid}$  *constr.*

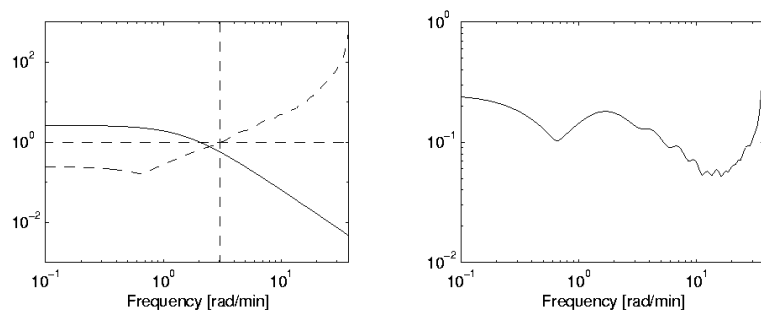
# Experimental Results 1

- Several Successful Field Tests
- Reactor Bed Temperature Control
  - System Identification (2nd order model + delay)
  - 1st order target, PI control

Actual vs. Predicted response



Estimated mult. Uncertainty and RSC



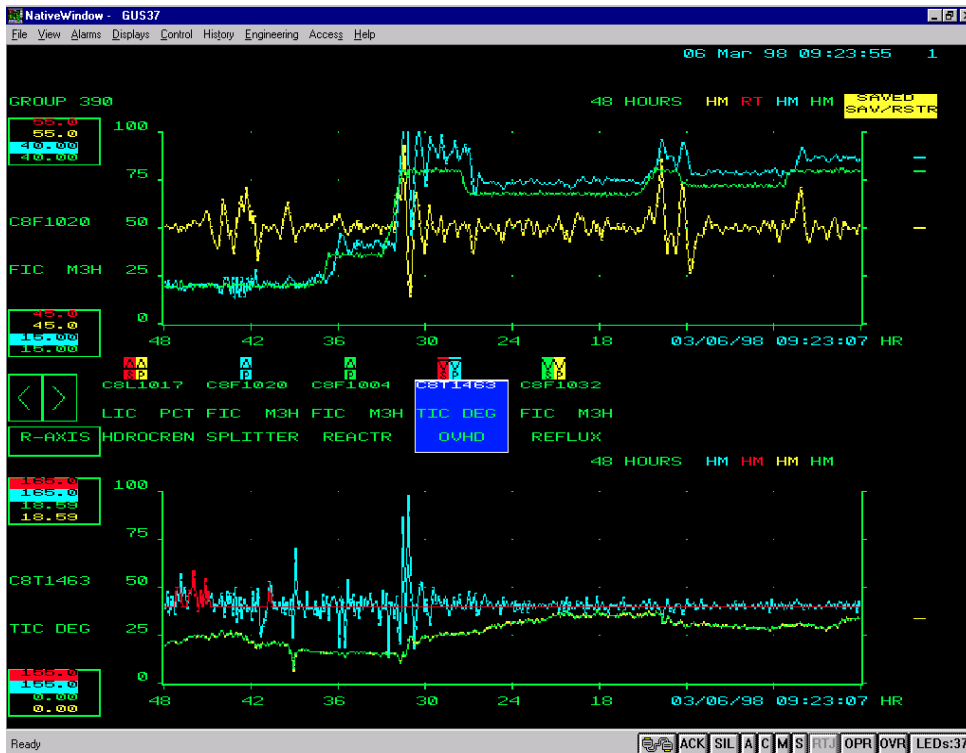
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# Experimental Results 1 (cont.)

- Closed Loop Response
  - (before and after)

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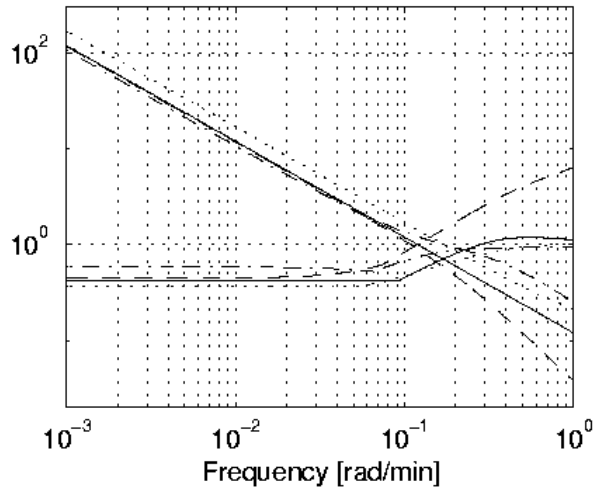


Levels and Flows

Reflux Flow rate and Inlet Temperature

# Experimental Results 2

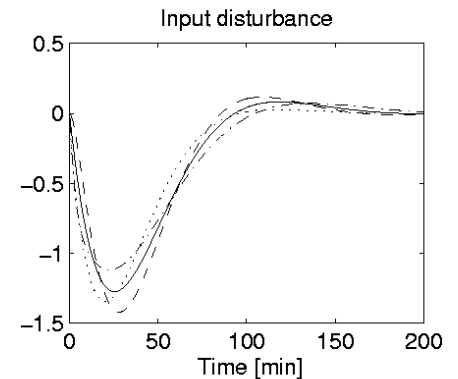
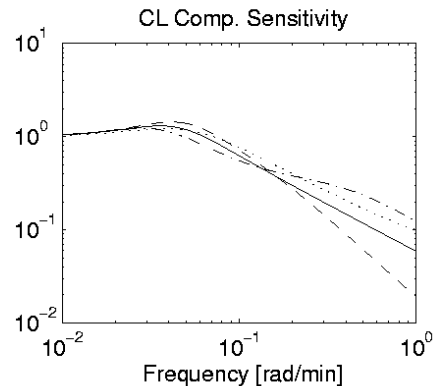
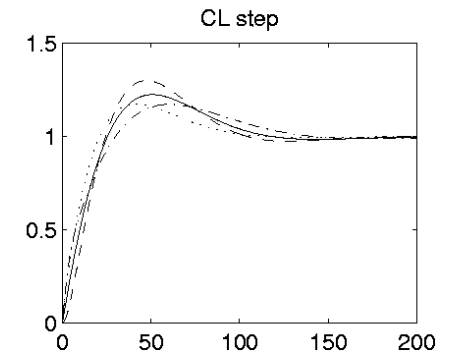
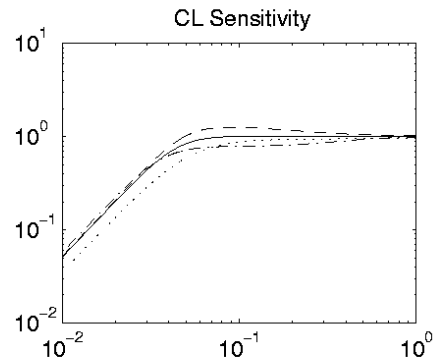
- Fractionator Inlet Header Pressure Control
  - 4 models (lack of data)
  - Integrating plants
  - Bandwidth constraints from the model differences
  - Target loop: 2nd order, 20% overshoot, PI controller



Plant model frequency responses  
and multiplicative uncertainty

## Experimental Results 2 (cont.)

- Closed-Loop Responses
  - Simulated (no recorded data)
  - Consistent with observations
- Higher Bandwidth PI's resulted in lightly damped or oscillatory behavior



# Conclusions

- Integrated identification and PID tuning
- Uncertainty estimation: important in determining feasible targets
- Quantitative measure of confidence
- Excellent disturbance attenuation properties are a result of sensitivity minimization
- Reliable controllers (minimal iterations, work well the first time)
- Software tools make the design “easy” (for most cases)
  - Highly automated, Numerically reliable, Modest expertise requirements
  - Quick solutions to typical problems; hard problems still stay hard!