

Robust operation by controlling the right variable combination

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Outline

- Introduction and motivation
 - What is self-optimizing control
 - Requirements for controlled variables
- Procedure for selecting combinations of measurements
 - How to find optimal combination?
 - Which measurements to select?
- Example:
 - Divided wall (Petlyuk) distillation column
- Conclusion
- References

Introduction and motivation

- Optimal operation for a given disturbance

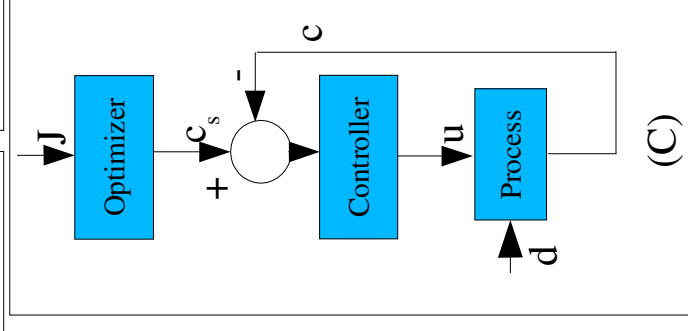
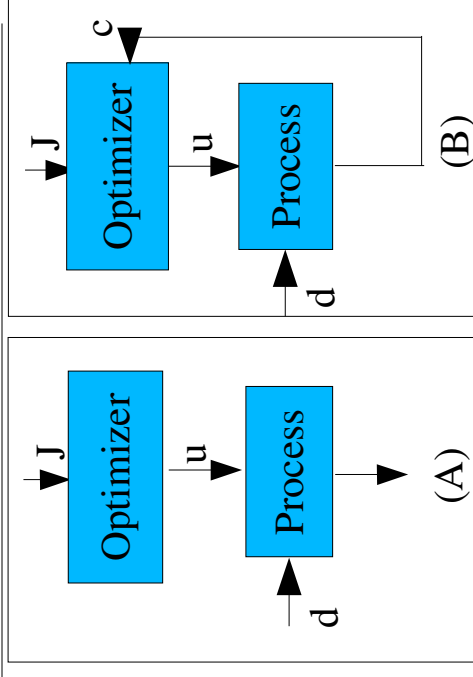
d:

$$\min_u J(x, u, d)$$

$$f(x, u, d) = 0$$

$$g(x, u, d) \leq 0$$

$$x \in X, d \in D$$



- **How to implement?**
 - Open loop structure (u_s) (A)
 - Optimizing controller (B).
 - **Self-optimizing control: Simple feedback control (C)**
- Controlling the right variables; key element in overcoming uncertainty

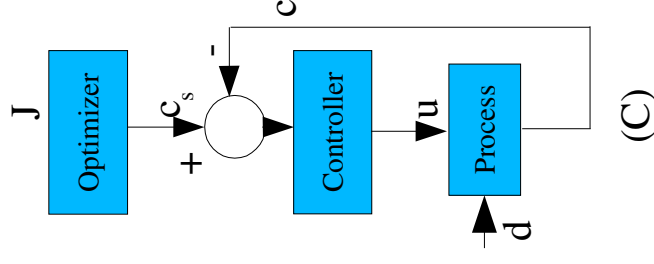
Self-optimizing control-Basics

- Define loss:

$$L = J(c_s + n, d) - J_{opt}(d)$$

- Self-optimizing control (Skogestad, 2000)
 - Self-optimizing control is when acceptable loss can be achieved using constant setpoints (c_s) for the controlled variables c (without re-optimizing when disturbances occur).

- Generally two classes of problems
 - Constrained: All DOF optimally constrained (easy)
 - **Unconstrained: Unconstrained DOF (here)**



Self-optimizing control-Basics (cont.)

- Controlled variables c to be selected among all available measurements y
- Previously:

$$c_1 = y_1, \quad c_2 = y_2$$

- Question: How to find the best combination?

$$c = f_y(y)$$

$$c = h_1 y_1 + h_2 y_2 + h_3 y_3 \dots = Hy$$

- **How to select H?**

Self-optimizing control-Basics

- Best self-optimizing structure:

$$\min_{H, u} [\max_{d, n} L(x, u, d, n, c_s, c)]$$

$$f(x, u, d) = 0$$

$$g(x, u, d) \leq 0$$

$$c = Hy$$

$$c(x, u, d) = c_s + n$$

$$d \in D, n \in N$$

- Non-convex and combinatorial optimization problem
- Difficult to solve for any realistic chemical process!
- **Need a much simpler method!**

Candidate controlled variables

- Requirements for good candidate controlled variables (Skogestad & Postlethwaite, 1996)
 1. Its optimal value $\mathbf{c}_{opt}(\mathbf{d})$ is insensitive to disturbances. $\longrightarrow \Delta c_{opt} = 0$
 2. It should be easy to measure and control accurately.
 3. The variable \mathbf{c} should be sensitive to change in inputs.
 4. The selected variables should be independent.

New proposed method for selecting variable combinations

- Calculate for small disturbances from the nominal point
 $u_{opt}(d) \longrightarrow y_{opt}(u_{opt}(d))$.
- Linear combination
- Perfect self-optimizing control
 - Achieved if
- Simply choose H such that
- As a consequence, we need at least as many measurements:

$$\Delta y_{opt} = F (d - d^0)$$

$$F = \frac{d(y_{opt})}{d d}$$

$$c = Hy$$

$$\Delta c_{opt} = HF \Delta d = 0$$

$$HF = 0$$

$$H \in null(F^T)$$

$$\#y = \#u + \#d$$

Candidate controlled variables (cont.)

- Requirements for good candidate controlled variables (Skogestad & Postlethwaite, 1996)

1. Its optimal value $c_{opt}(d)$ is insensitive to disturbances. $\longrightarrow \Delta c_{opt} = 0$

2. It should be easy to measure and control accurately.

3. The variable c should be sensitive to change in inputs. \longrightarrow Implementation error

4. The selected controlled variables should be independent.

Candidate controlled variables (cont.)

- Taylor series expansion of loss function (Skogestad et. al, 1998)
- Two contributions to the loss

$$\Delta c = G \Delta u + G_d \Delta d$$

$$J_{uu} = \frac{\partial^2 J}{\partial u \partial u}$$

$$J_{du} = \frac{\partial^2 J}{\partial d \partial u}$$

$$L = \frac{1}{2} e_u^T J_{uu} e_u$$

$$e_u = u - u_{opt}(d) = (J_{uu}^{-1} J_{du} - G^{-1} G_d)(d - d^0) + G^{-1} n$$

Disturbance effect (OK!)

Implementation error contribution

Proposed approach for reducing implementation error

- Some freedom in choosing measurements to reduce implementation error.
- If $\#y > \#u + \#d$
 - Select the **most independent measurements** for use in $c=Hy$

– Scaled linearized model

– Augmented plant

– Maximize the minimum singular value of augmented plant

$$\Delta y = G^y \Delta u + G_d^y \Delta d$$

$$\Delta y = \tilde{G} \tilde{u} = [G^y \ G_d^y][u \ d]^T$$

$$\max_{y \in Y} \underline{\sigma}(\tilde{G}), \quad \tilde{G} = [G^y \ G_d^y]$$

Proposed method – Summarized

- Summarized;
 - Select $m=n+k$ measurements that
 - Compute F , and find H such that it is spanned by the left null space of F .
 - Implies that
 - Let the controlled variables be

$$\max_{y \in Y} \underline{\sigma}(\tilde{G})$$

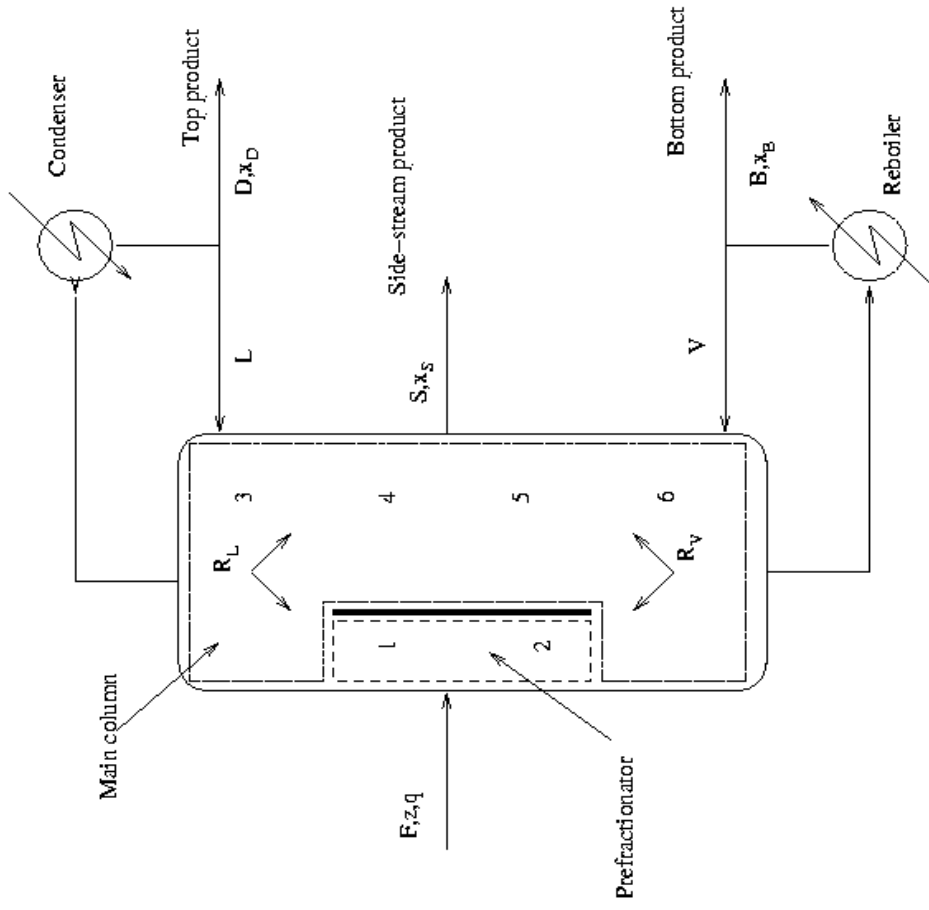
$$H \in \text{null}(F^T)$$

$$\Delta c_{opt} = HF \Delta d = 0$$

$$c = Hy$$

- Selection of measurements give “independent measurements”
- Perfect self-optimizing properties locally if we neglect implementation error

Divided wall (Petlyuk) distillation column



- Energy and capital cost savings up to 30% (Smith & Triantafyllou, 1992)
- $J=V$
- Relative volatility: $[\alpha_A \ \alpha_B \ \alpha_C] = [4 \ 2 \ 1]$
- 5 steady-state degrees of freedom $u = [V \ L \ S \ R_l \ R_v]^T$
- Major disturbances $d = [z_A \ q]^T = [z_A^0 \pm 0.1 \ q^0 \pm 0.1]^T$
- Active constraints $g = [x_{A,D} \ x_{B,S} \ x_{C,B}]^T$
- $DOF=5-3=2$

Divided wall (Petlyuk) distillation column (cont.)

- R_V fixed: usually OK
- Second controlled variable:
 - Single temperature: poor
 - Temperature symmetry (Halvorsen, 1998)

$$DT_s = (T_{1,i} - T_{4,i}) - (T_{2,i} - T_{5,i})$$

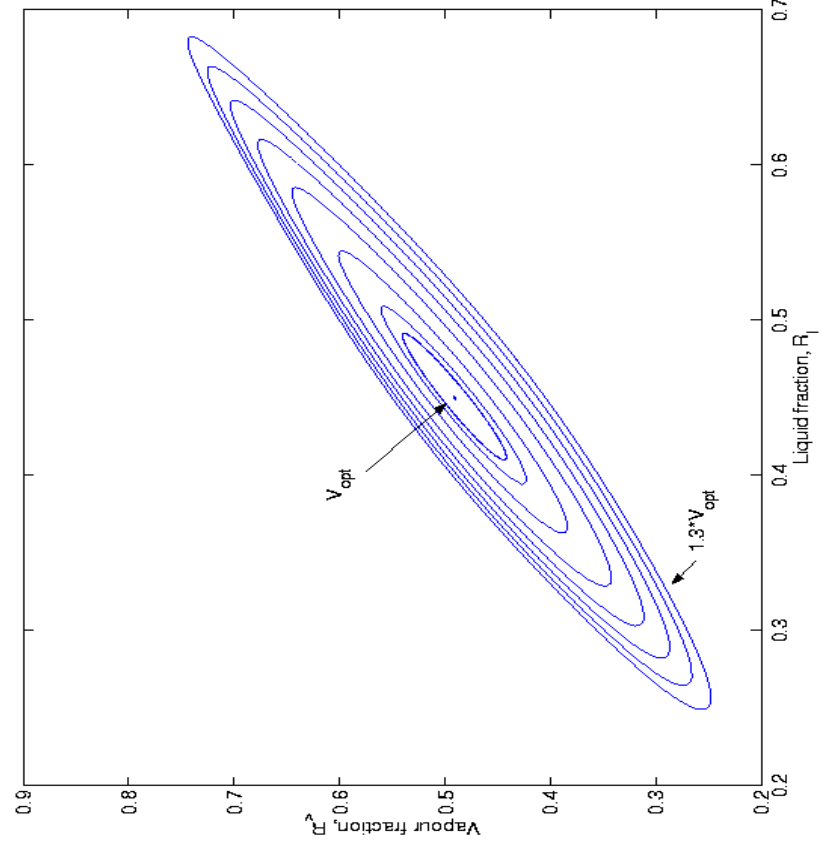
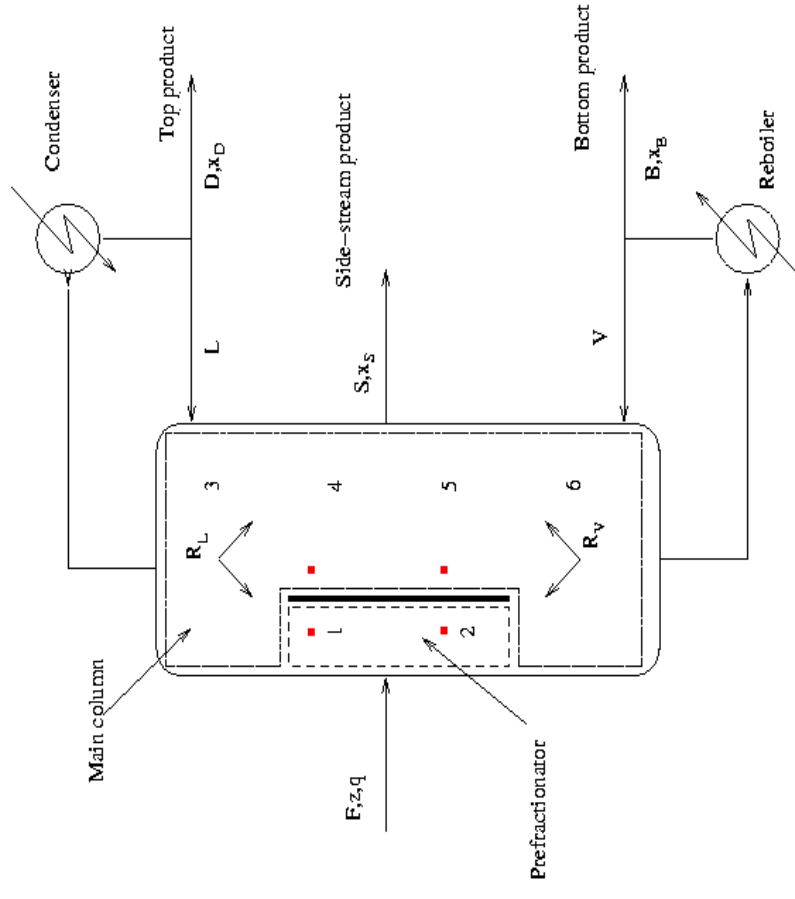


Figure 2: Contour plot $J(R_L, R_V)$



Divided wall (Petlyuk) distillation column (cont.)

R_v -fixed (1 DOF left)

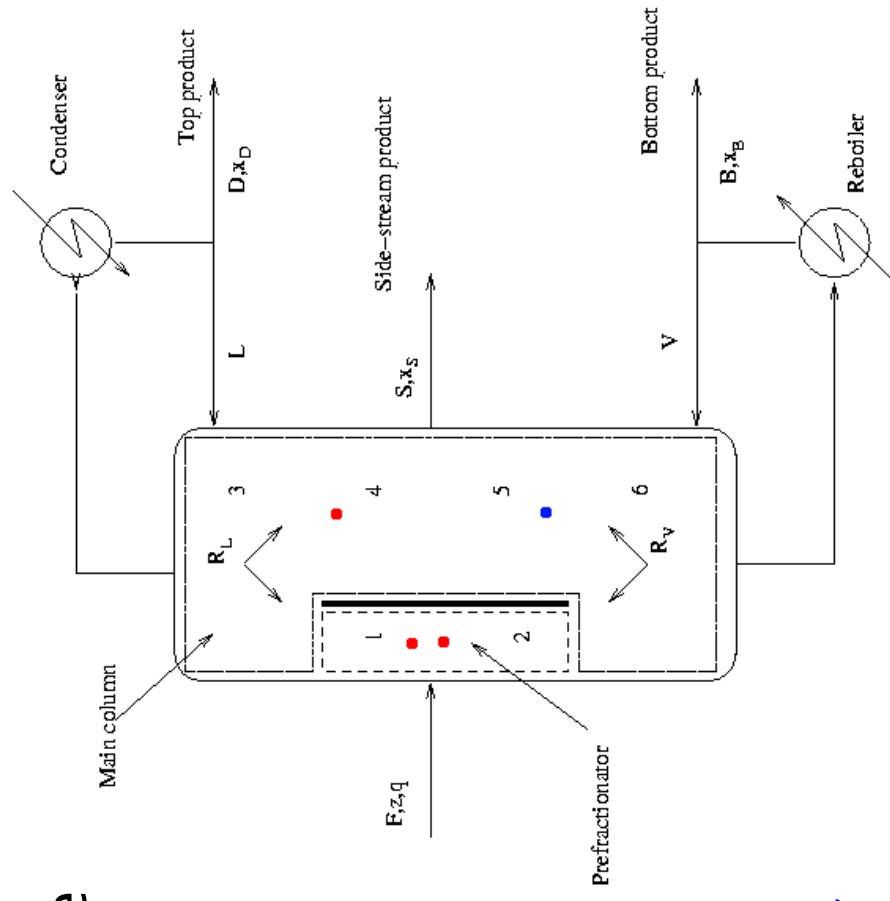
- Following the method outlined above we need at least

$$- \#y = \#u + \#d = 1 + 2 = 3$$

$$- c_{LC,3} = -0.523 T_{1,6} + 0.27 T_{2,1} + 0.83 T_{4,2}$$

R_v -variable (2 DOF left)

- Number of measurements
- $\#y = \#u + \#d = 2 + 2 = 4$
- $c_{LC,1} = -0.32 T_{1,6} + 0.12 T_{2,1} - 0.57 T_{4,2} + 0.74 T_{5,7}$
- $c_{LC,2} = -0.70 T_{1,6} + 0.34 T_{2,1} + 0.61 T_{4,2} - 0.12 T_{5,7}$

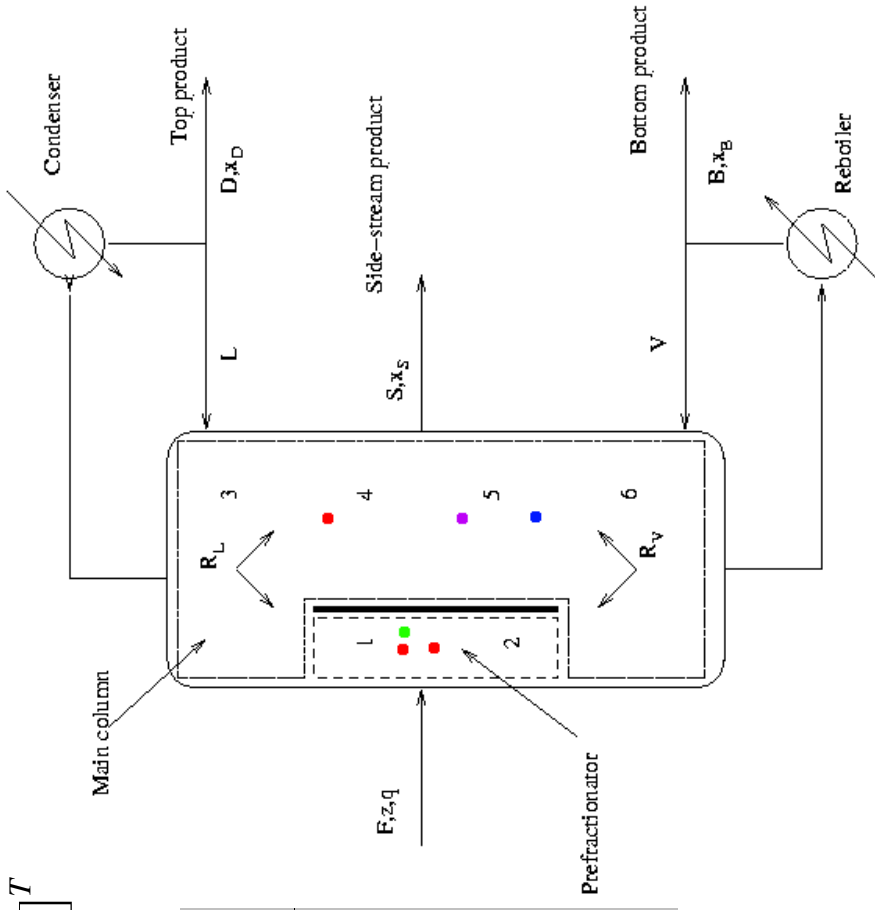


Divided wall (Petlyuk) distillation column (cont.)

- Loss for the proposed structures (combined disturbance and noise norm bounded)

$$d = [z_A \ q]^T = [z_A^0 \pm 0.1 \ q^0 \pm 0.1]^T$$

$$n = [n_{R_v} \ n_{R_i} \ n_T]^T = [\pm 0.05 \ \pm 0.05 \ \pm 0.4]^T$$



C_1	C_2	Rank	Average		Worst case	
			Loss(%)	Loss(%)	Loss(%)	Loss(%)
$C_{LC,1}$	$C_{LC,2}$	1	0.12%	0.32%	0.32%	0.32%
R_v	$C_{LC,3}$	2	0.34%	0.97%	0.97%	0.97%
R_v	DT_s	3	2.80%	4.35%	4.35%	4.35%
R_v	$T_{1,7}$	4	8.60%	16.60%	16.60%	16.60%
R_v	R_i	5	11.29%	55.82%	55.82%	55.82%
R_v	$T_{5,2}$	6	infeasible	infeasible	infeasible	infeasible

Conclusion

- Focus on how to **implement** optimal operation by finding good self-optimizing control structure.
- Proposed a new **simple** method for selecting controlled variables as a linear combination of the measurements with perfect self-optimizing control for small disturbances
- Proposed a method on how to select the necessary measurements
 - $\#y = \#u + \#d$
 - “independent measurements as possible”
- Local information
- Illustrated the method on a Divided wall (Petlyuk) distillation column
 - Negligible loss by controlling the right variable combination
 - OK to fix R_v

Acknowledgment



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References

- Alstad, V., Skogestad, S., “Robust operation by controlling the right variable combination”, In AIChE Annual Meeting, Indianapolis, 2002.
- Halvorsen, I., “Minimum energy requirements in complex Distillation Arrangements, PhD Thesis, Dep. of Chemical Engineering, Norwegian University of Science and Technology, 2001.
- Smith, R. & Triantafyllou, C., “The design and operation of fully thermally coupled distillation columns”, *Trans. IChemE.*, 1992.
- Skogestad. S., “Planwide control: the search for the optimal control structure”, *J. Proc. Control*, **10**, 487-507, 2000.
- Skogestad. S. & Postlethwaite, I., “Multivariable feedback control”, *John Wiley & Sons*, 1996.
- Skogestad. S. , Halvorsen, I. & Morud, J.C, “Self-optimizing control: The basic idea and taylor series analysis”, In AIChE Annual meeting, Miami, FL., 1998.