

Part 1.

**Plantwide process control
«Control architectures»**

Sigurd Skogestad

Plantwide control

Introduction

- Objective: Put controllers on flow sheet (make P&ID)
- Two main objectives for control: Longer-term economics (CV1) and shorter-term stability (CV2)
- Regulatory (basic) and supervisory (advanced) control layer

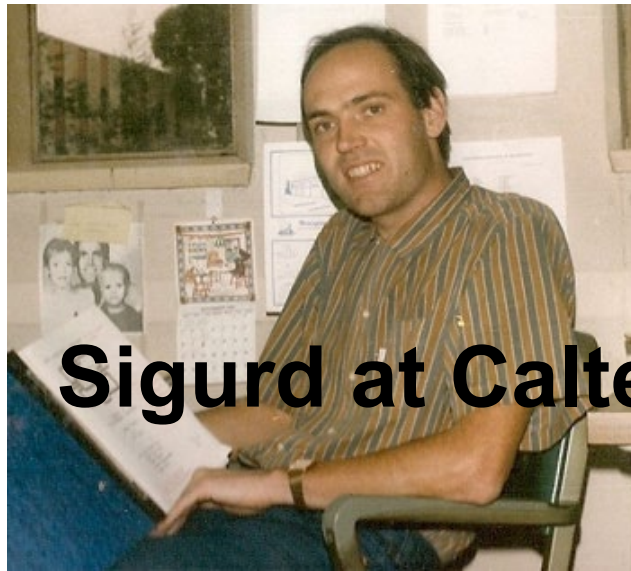
Optimal operation (economics)

- Define cost J and constraints
- Active constraints (as a function of disturbances)
- Selection of economic controlled variables (CV1). Self-optimizing variables.

How can we design a control system for a complete chemical plant?

Where do we start?

What should we control? And why?



Sigurd at Caltech (1984)

How we design a control system for a complete chemical plant?

- Where do we start?
- What should we control? and why?
- etc.
- etc.

Control system structure*

Alan Foss (“Critique of chemical process control theory”,
AIChE Journal, 1973):

*The central issue to be resolved ... is the determination of **control system structure***.
**Which variables should be measured, which inputs should be manipulated
and which links should be made between the two sets?***



*Current terminology: **Control system architecture**

Plantwide control = Control structure design

- *Not* the tuning and behavior of each control loop...
- But rather the *control philosophy* of the overall plant with emphasis on the ***structural decisions***:
 - Selection of controlled variables (“outputs”)
 - Selection of manipulated variables (“inputs”)
 - Selection of (extra) measurements
 - Selection of control **configuration** (structure of overall controller that interconnects the controlled, manipulated and measured variables)
 - Selection of controller type (LQG, H-infinity, PID, decoupler, MPC etc.)

QUIZ

What are the three most important inventions of process control?

- Hint 1: According to Sigurd Skogestad
- Hint 2: All were in use around 1940

SOLUTION

1. PID controller, in particular, I-action
2. Cascade control
3. Ratio control

Main objectives of a control system

1. Economics: Implementation of acceptable (near-optimal) operation
2. Regulation: Stable operation

ARE THESE OBJECTIVES CONFLICTING?

- Usually NOT
 - Different time scales
 - Stabilization → fast time scale
 - Stabilization doesn't "use up" any degrees of freedom
 - Reference value (setpoint) available for layer above
 - But it "uses up" part of the time window (frequency range)

How to put optimization into the control layer?

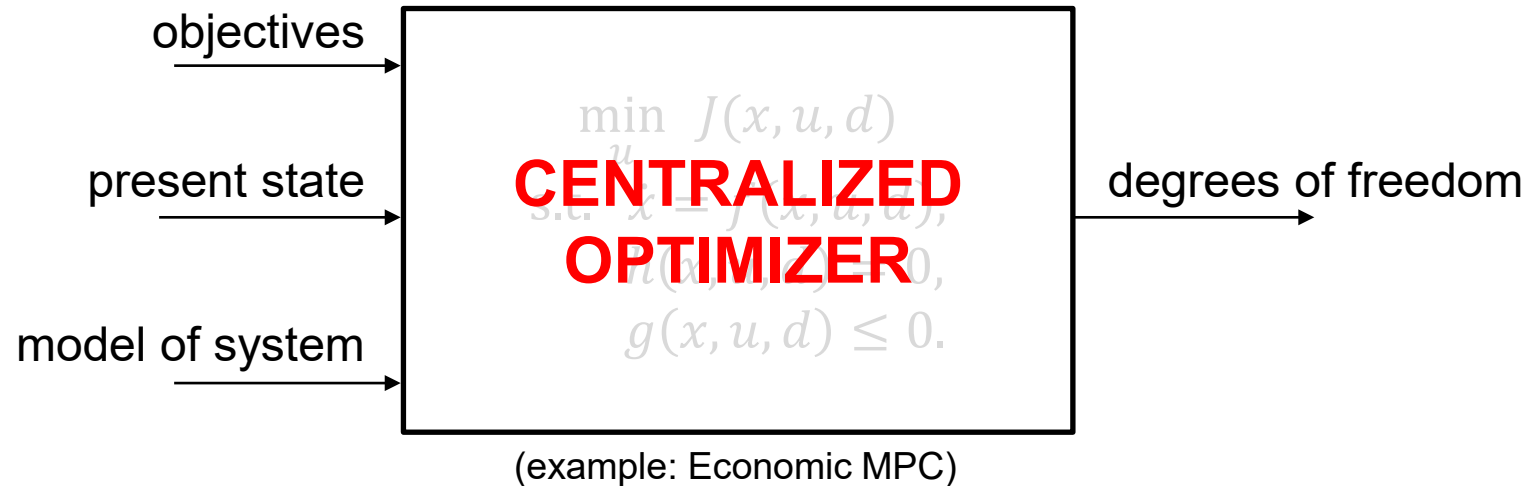
Optimal operation

General approach: minimize cost / maximize profit, subject to satisfying constraints (product quality, environment, resources)

Mathematically,

$$\begin{aligned} & \min_u J(x, u, d) \\ \text{s.t. } & \dot{x} = f(x, u, d), \\ & h(x, u, d) = 0, \\ & g(x, u, d) \leq 0. \end{aligned}$$

Optimal operation (in theory)



Procedure:

- Obtain model of overall system
- Estimate present state
- Optimize all degrees of freedom

Problems:

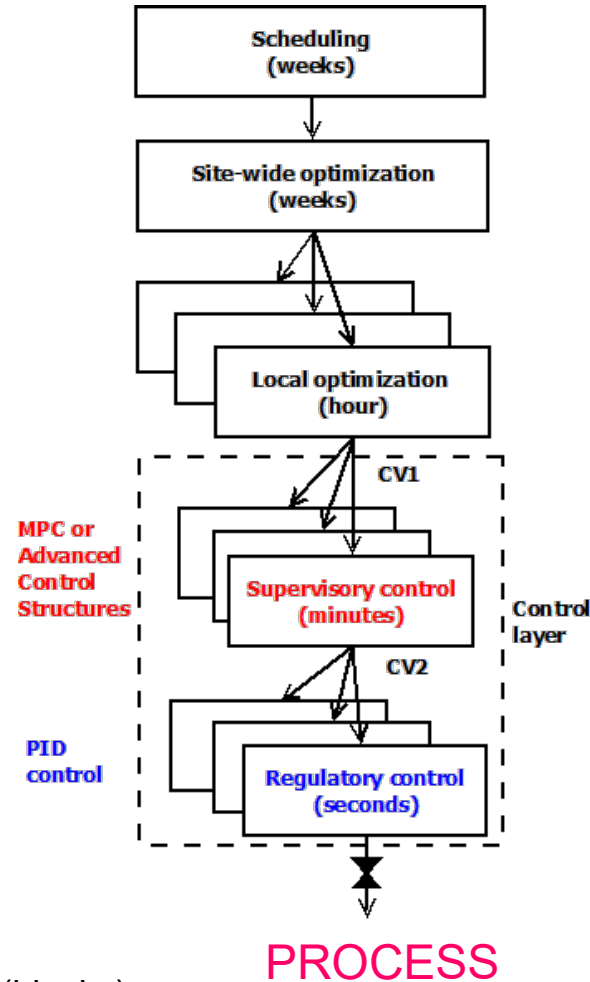
- Model not available
- Optimization is complex
- Not robust (difficult to handle uncertainty)
- Slow response time

Engineering systems

- Most (all?) large-scale engineering systems are controlled using hierarchies of quite simple controllers
 - Large-scale chemical plant (refinery)
 - Commercial aircraft
- 100's of loops
- Simple components:
 - on-off + PI-control + nonlinear fixes + some feedforward

Two fundamental ways of decomposing the controller

- Vertical (hierarchical; cascade)
- Based on **time scale separation**
- Decision: Selection of CVs that connect layers



- Horizontal **(decentralized)**
- Usually based on distance
- Decision: Pairing of MVs and CVs within layers

In addition: Decomposition of controller into smaller elements (blocks):
Feedforward element, nonlinear element, estimators (soft sensors), switching elements

Time scale separation: Control* layers

Two objectives for control: Stabilization and economics

- **Supervisory (“advanced”) control layer**

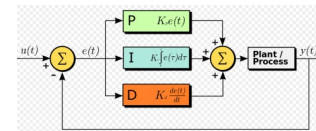
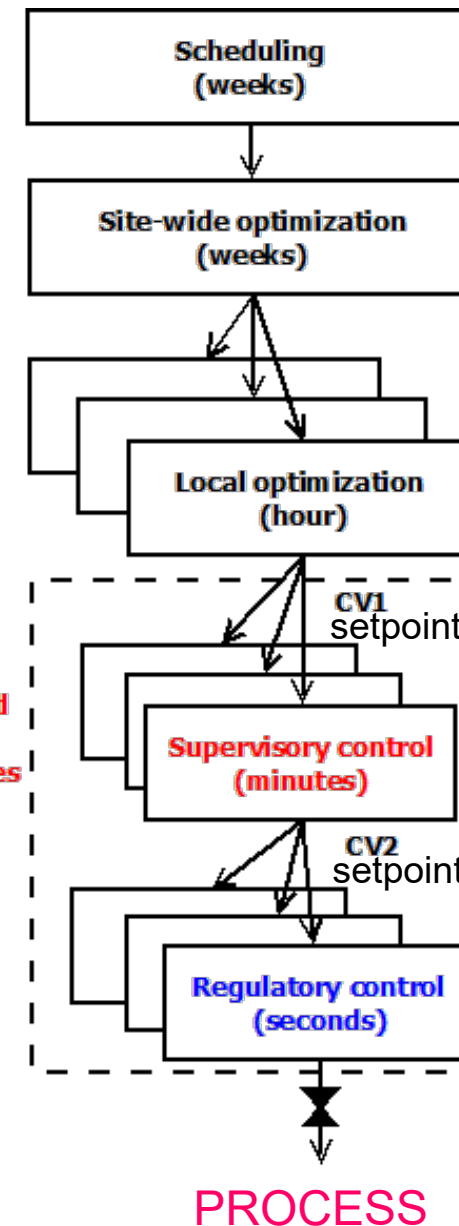
Tasks:

- Follow set points for CV1 from economic optimization layer
- Switch between active constraints (change CV1)
- Look after regulatory layer (avoid that MVs saturate, etc.)

- **Regulatory control (PID layer):**

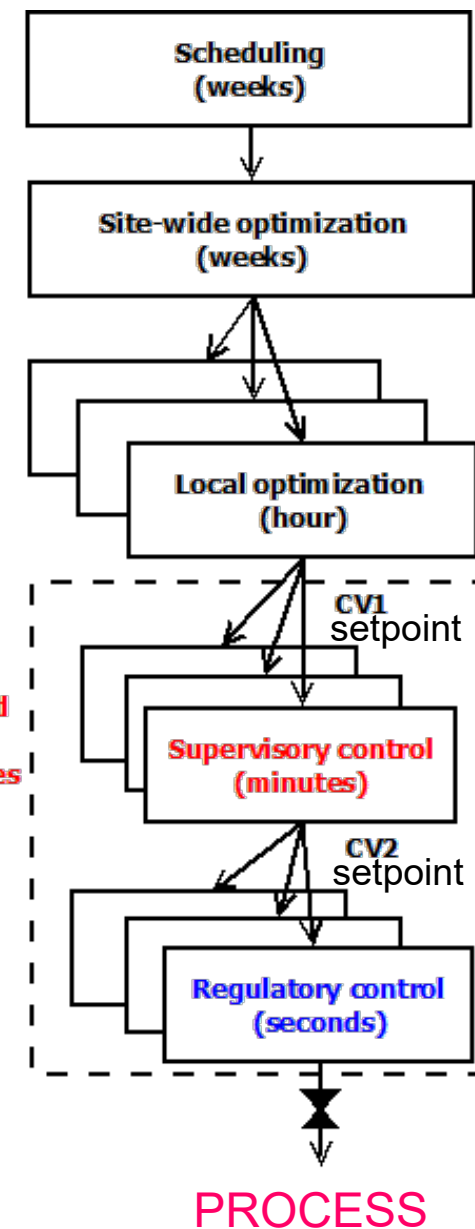
- Stable operation (CV2)

*My definition of «control» is that the objective is to track setpoints

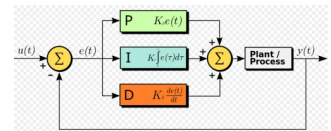


«Advanced» control

- Advanced: This is a relative term
- Usually used for anything than comes in addition to (or in top of) basic PID loops
- Mainly used in the «supervisory» control layer
- Two main options
 - **Standard «Advanced regulatory control» (ARC) elements**
 - Based on decomposing the control system
 - Cascade, feedforward, selectors, etc.
 - This option is preferred if it gives acceptable performance
 - **Model predictive control (MPC)**
 - Requires a lot more effort to implement and maintain
 - Use for interactive processes
 - Use with known information about future (use predictive capabilities)



Control layer



Combine control and optimization into one layer?

EMPC: Economic model predictive “control”

$$J_{EMPC} = J + J_{control}$$

Penalize input usage, $J_{control} = \sum \Delta u_i^2$

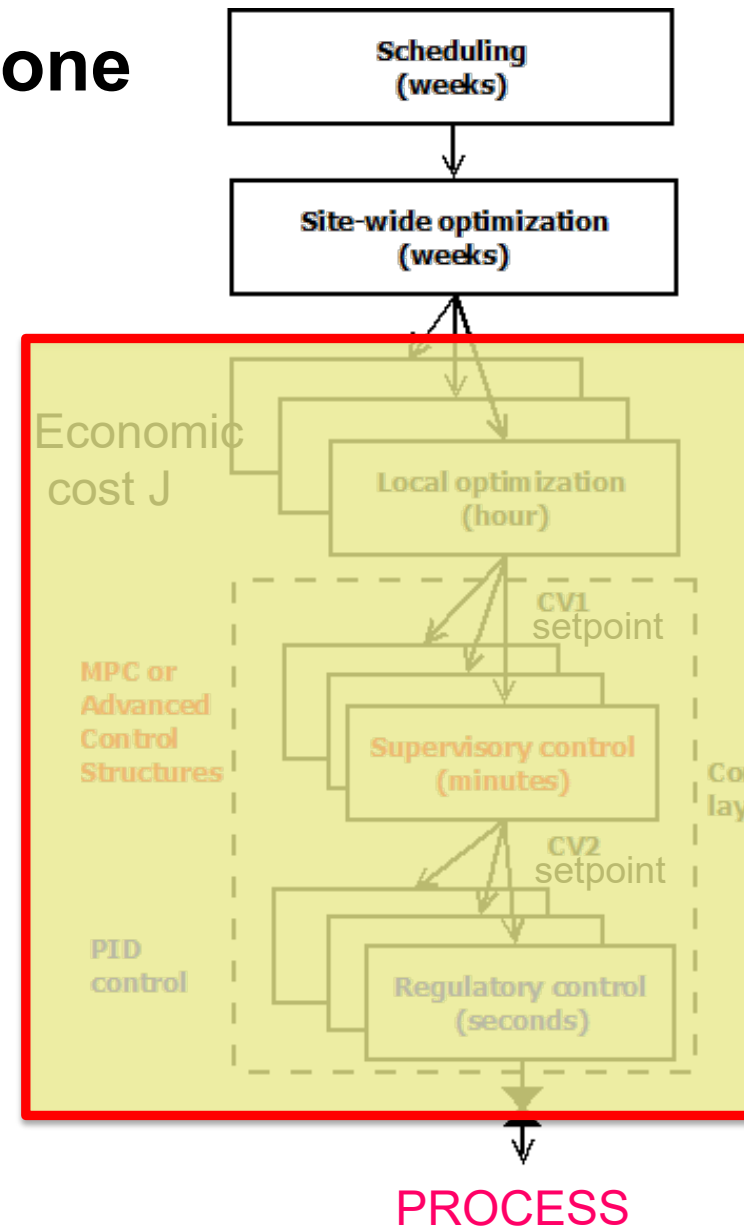
NO, combining layers is generally not a good idea!
(the good idea is to separate them!)

One layer (EMPC) is optimal theoretically, but

- Need detailed dynamic model of everything
- Tuning difficult and indirect
- Slow! (or at least difficult to speed up parts of the control)
- Robustness poor
- Implementation and maintenance costly and time consuming

Typical economic cost function:

$$J [\$/s] = \text{cost feed} + \text{cost energy} - \text{value products}$$



EMPC
(no setpoints
CV1, CV2)

What about «conventional» RTO and MPC?

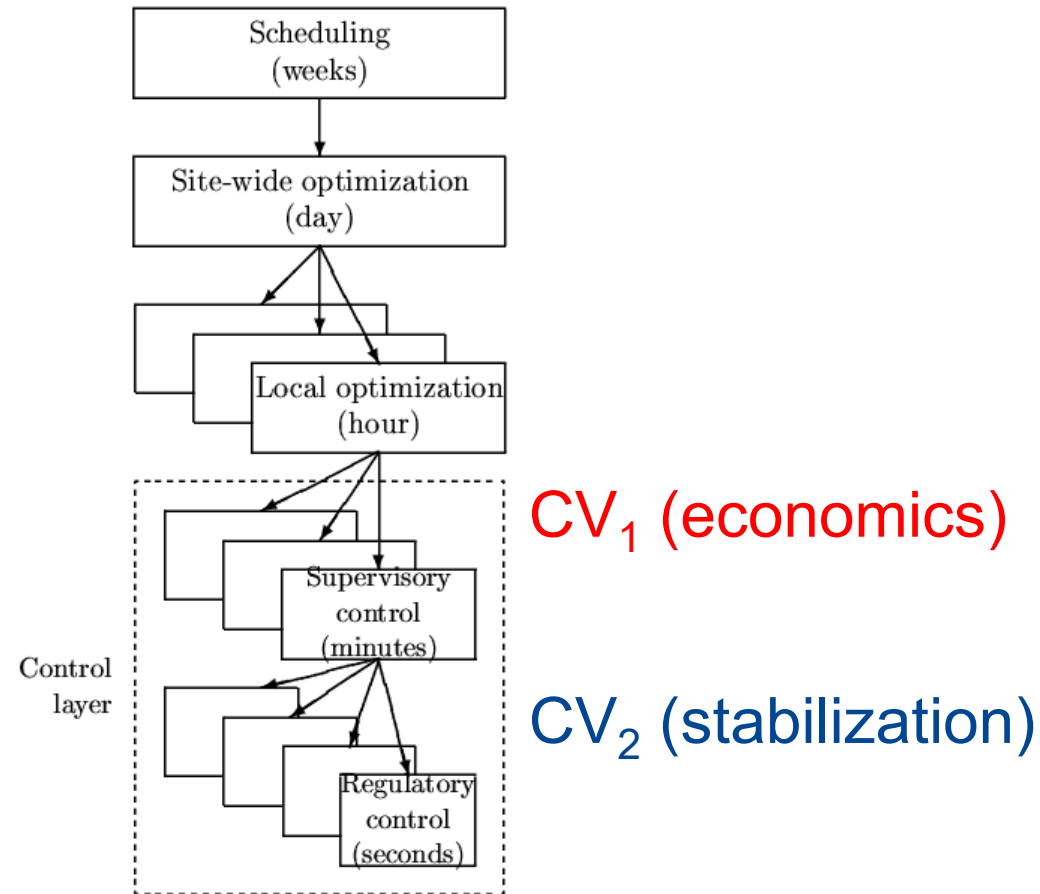
- Yes, it's OK
- Both has been around for more than 50 years (since 1970s)
 - but the expected growth never came
- MPC is still used mostly in large-scale plants (petrochemical and refineries).
- MPC is far from replacing PID as some expected in the 1990s.
- But plants need to be run optimally:
 - ⇒ Need something else than conventional RTO/MPC!

Alternative solutions for advanced control

- Would like: Feedback solutions that can be implemented with minimum need for models
- **Machine learning?**
 - Requires a lot of data, not realistic for process control
 - And: Can only be implemented after the process has been in operation
- **“Classical advanced regulatory control“ (ARC) based on single-loop PIDs?**
 - **YES!**
 - Extensively used by industry
 - Problem for engineers: Lack of design methods
 - Has been around since 1930's
 - But almost completely neglected by academic researchers
 - Main fundamental limitation: Based on single-loop (need to choose pairing)

ARC = Advanced regulatory control

Optimal operation and control objectives: What should we control?



Outline

Skogestad procedure for control structure design:

I. Top Down (analysis)

- Step S1: Define operational objective (cost) and constraints
- Step S2: Identify degrees of freedom and optimize operation for disturbances
- Step S3: Implementation of optimal operation
 - What to control? (CV1) (self-optimizing control)
- Step S4: Where set the production rate (TPM)? (Inventory control)

II. Bottom Up (design)

- Step S5: Regulatory control: What more to control (CV2)?
- Step S6: Supervisory control
- Step S7: Real-time optimization

TPM = Throughput manipulator

Step S1. Define optimal operation (economics)

- What are the ultimate goals of the operation?
- Typical cost function*:

$$J = \text{cost feed} + \text{cost energy} - \text{value products}$$

*No need to include fixed costs (capital costs, operators, maintenance) at "our" time scale (hours)

Note: $J = -P$ where $P =$ Operational profit

Example: distillation column

- Distillation at steady state with given p and F : $N=2$ DOFs, e.g. L and V (\mathbf{u})
- **Cost to be minimized (economics)**

cost energy (heating + cooling)

$$J = -P \text{ where } P = p_D D + p_B B - p_F F - p_V V$$

value products

cost feed

- **Constraints**

Purity D: For example, $x_{D, \text{impurity}} \leq \max$

Purity B: For example, $x_{B, \text{impurity}} \leq \max$

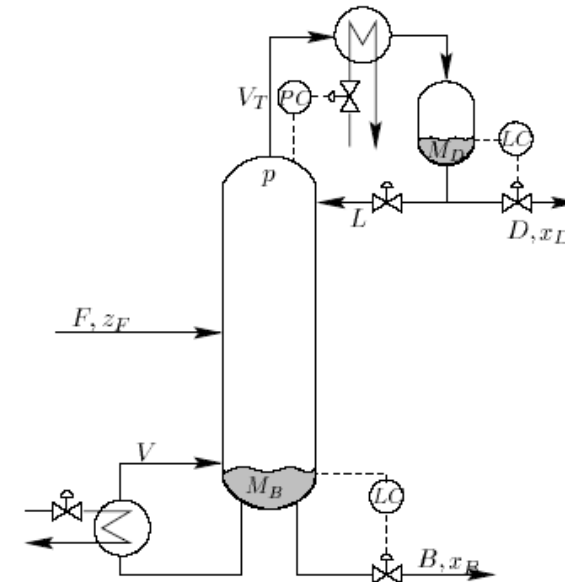
Flow constraints: $\min \leq D, B, L \text{ etc.} \leq \max$

Column capacity (flooding): $V \leq V_{\max}$, etc.

Pressure: 1) p given (d) 2) p free (\mathbf{u}): $p_{\min} \leq p \leq p_{\max}$

Feed: 1) F given (d) 2) F free (\mathbf{u}): $F \leq F_{\max}$

- Optimal operation: Minimize J with respect to steady-state DOFs (\mathbf{u})



Outline

Skogestad procedure for control structure design:

I. Top Down

- Step S1: Define operational objective (cost) and constraints
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- Step S3: Implementation of optimal operation
 - What to control? (primary CV's) (self-optimizing control)
- Step S4: Where set the production rate? (Inventory control)

II. Bottom Up

- Step S5: Regulatory control: What more to control (secondary CV's)?
- Step S6: Supervisory control
- Step S7: Real-time optimization

Step S2. Optimize

(a) Identify degrees of freedom

(b) Optimize for expected disturbances

- Need good model, usually steady-state
- Optimization is time consuming! But it is offline
- Main goal: Identify ACTIVE CONSTRAINTS
- A good engineer can often guess the active constraints



Step S2a: Degrees of freedom (DOFs) for operation

NOT as simple as one may think!

To find all operational (**dynamic**) degrees of freedom:

- Count valves! (N_{valves})
- “Valves” also includes adjustable compressor power, etc.
Anything we can manipulate!

BUT: not all these have a (**steady-state**) effect on the economics

Steady-state degrees of freedom (DOFs)

IMPORTANT!

DETERMINES THE NUMBER OF VARIABLES TO CONTROL!

- **No. of primary CVs = No. of steady-state DOFs**

Methods to obtain no. of steady-state degrees of freedom (N_{ss}):

1. Equation-counting

- N_{ss} = no. of variables – no. of equations/specifications
- Very difficult in practice

2. Valve-counting (easier!)

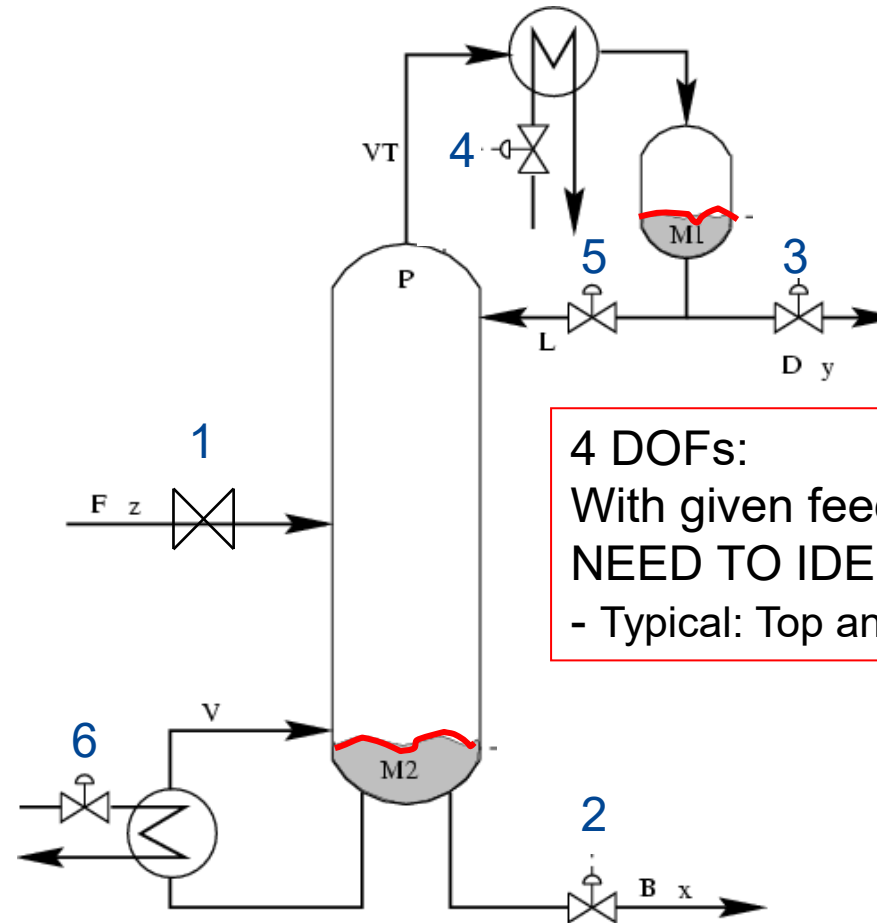
- $N_{ss} = N_{valves} - N_{0ss} - N_{specs}$
- N_{valves} : **include also variable speed for compressor/pump/turbine**
- N_{specs} : **Fixed variables (which are not later included in constraints)**
- N_{0ss} = **variables with no steady-state effect**
 - **Inputs/MVs with no steady-state effect (e.g. extra bypass)**
 - **Outputs/CVs with no steady-state effect that need to be controlled (e.g., liquid levels)**

3. Potential number for some units (useful for checking!)

4. Correct answer: Will eventually find it when we perform optimization

CV = controlled variable

Example: typical distillation column



4 DOFs:

With given feed and pressure:
NEED TO IDENTIFY 2 more CV's
 - Typical: Top and btm composition

$$N_{\text{valves}} = 6, \quad N_{0y} = 2^*,$$

$$N_{\text{DOF,SS}} = 6 - 2 = 4 \text{ (including feed and pressure as DOFs.)}$$

If feed and pressure are fixed: $N_{\text{specs}} = 2$ and $N_{\text{DOF,ss}} = 4 - 2 = 2$

* N_{0y} : no. controlled variables (liquid levels) with no steady-state effect

Step S2b: Optimize for expected disturbances

- What are the optimal values for our degrees of freedom u (MVs)?

$$J = \text{cost feed} + \text{cost energy} - \text{value products}$$

- Minimize J with respect to u for given disturbance d (usually steady-state):

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

subject to:

- Model equations : $\dot{x} = f(x, u, d) = 0$
- Operational constraints: $g(x, u, d) \leq 0$

OFTEN VERY TIME CONSUMING

- Commercial simulators (Aspen, Unisim/Hysys) are set up in “design mode” and often work poorly in “operation (rating) mode”.
- Optimization methods in commercial simulators often poor
 - We can use Matlab or even Excel “on top”

.... BUT A GOOD ENGINEER CAN OFTEN GUESS THE SOLUTION (active constraints)

Outline

Skogestad procedure for control structure design:

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- Step S1: Define operational objective (cost) and constraints
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II. Bottom Up

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Step S3. Implementation of optimal operation

- Now we have found the optimal way of operation. How should it be implemented?
- **What to control?** (primary CV's)
 1. Active constraints
 2. Self-optimizing variables (for unconstrained degrees of freedom)

Optimal operation of runner

- Cost to be minimized: $J = T$ (total time)
- One degree of freedom: $u = \text{power}$
- What should we control?



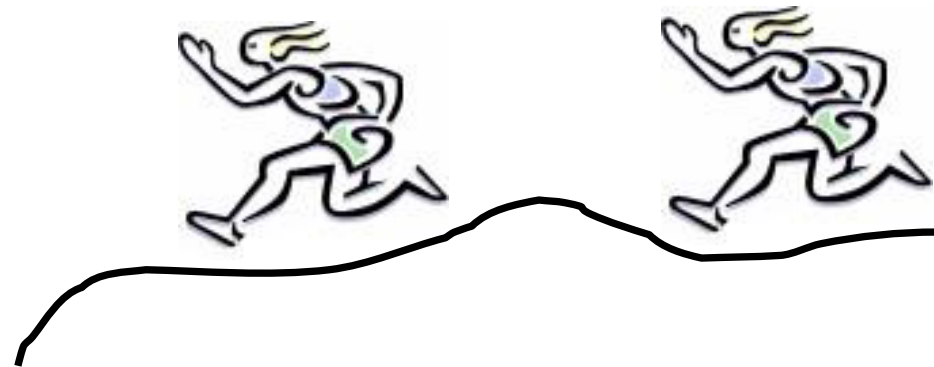
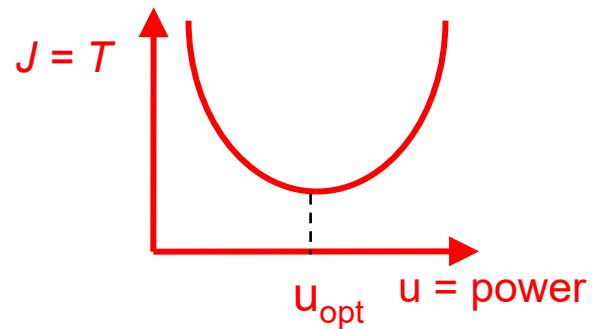
1. Sprinter case

- 100 meters run. $J = T$
- **Active constraint control:**
 - Maximum speed ("no thinking required")
 - CV = power (at max)



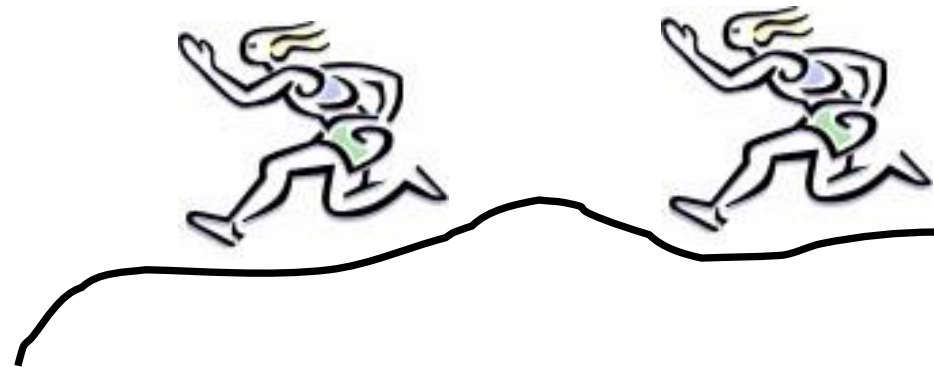
2. Marathon runner case

- 40 km run. $J = T$ (total time)
- What should we control? $CV = ?$
- **Unconstrained optimum:**

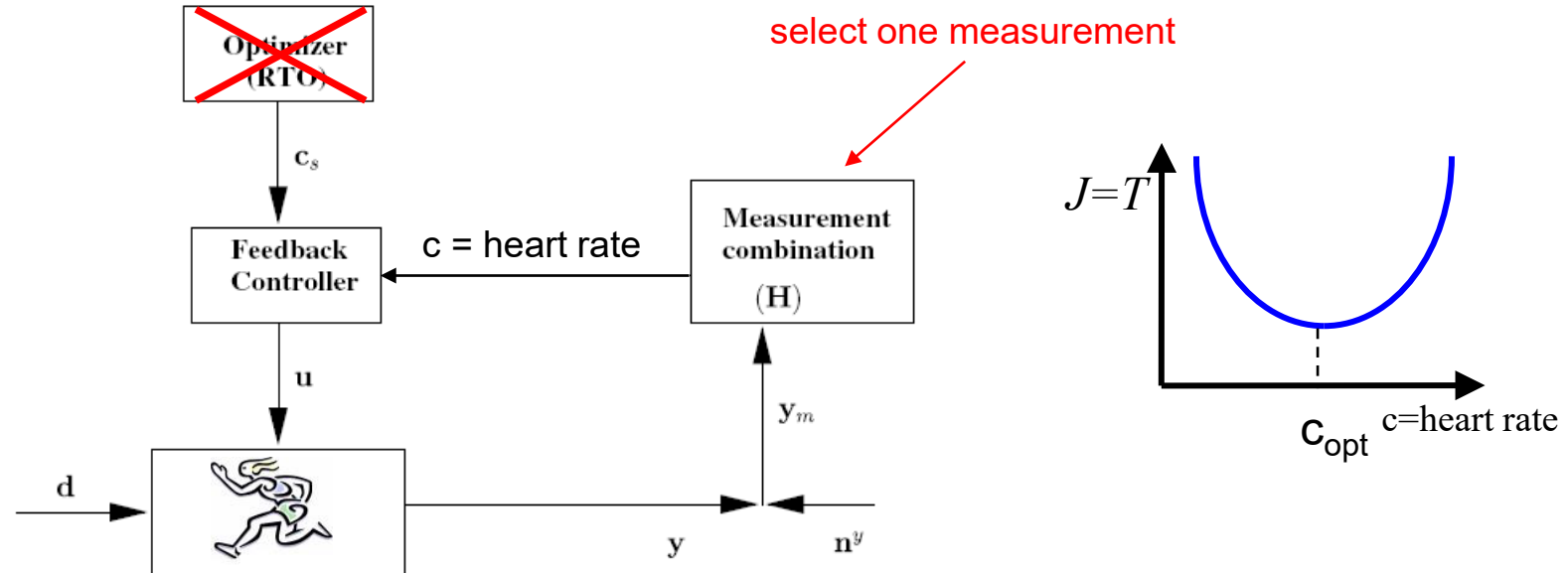


Self-optimizing control: Marathon

- Any self-optimizing variable (to control at constant setpoint)?
 - c_1 = distance to leader of race
 - c_2 = speed
 - c_3 = heart rate
 - c_4 = level of lactate in muscles



Conclusion Marathon runner



- CV = heart rate is good “self-optimizing” variable
- Simple and robust implementation
- Disturbances are indirectly handled by keeping a constant heart rate
- May have infrequent adjustment of setpoint (c_s)

Step S3: What should we control (**c**)?

(primary controlled variables $y_1 = c$)

Selection of controlled variables c :

- 1. Control active constraints!**
- 2. Unconstrained degrees of freedom: find and control self-optimizing variables!**

Sigurd's rules for CV selection

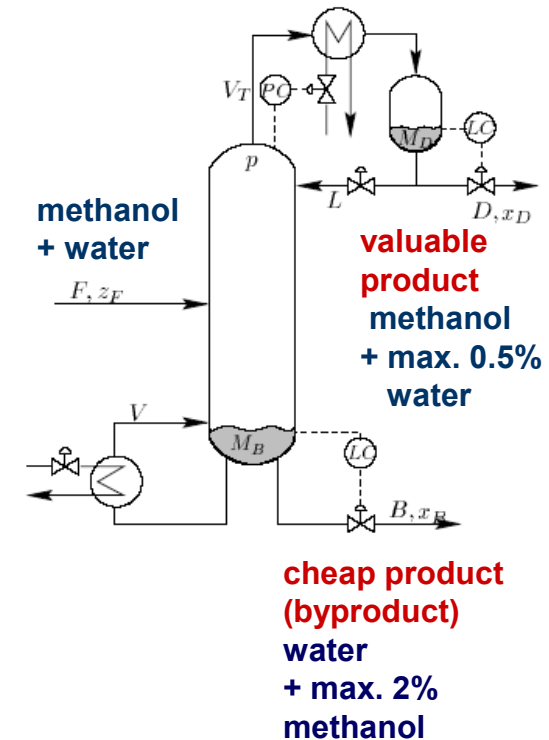
1. Always control active constraints! (almost always)
2. Purity constraint on expensive product always active (no overpurification):
 - (a) "Avoid product give away" (e.g., sell water as expensive product)
 - (b) Save energy (costs energy to overpurify)
3. **Unconstrained optimum: NEVER try to control a variable that reaches max or min at the optimum**
 - In particular, never try to control directly the cost J
 - - Assume we want to minimize J (e.g., $J = V = \text{energy}$) - and we make the stupid choice of selecting $CV = V = J$ - Then setting $J < J_{\min}$: Gives infeasible operation (cannot meet constraints) - and setting $J > J_{\min}$: Forces us to be nonoptimal (which may require strange operation; see Exercise on recycle process)

Distillation: expected active constraints

- Both products (D, B) generally have purity specs
- Valuable product: Purity spec. always active
 - Reason: Amount of valuable product (D or B) should always be maximized
 - Avoid product “give-away” (“Sell water as methanol”)
 - Also saves energy

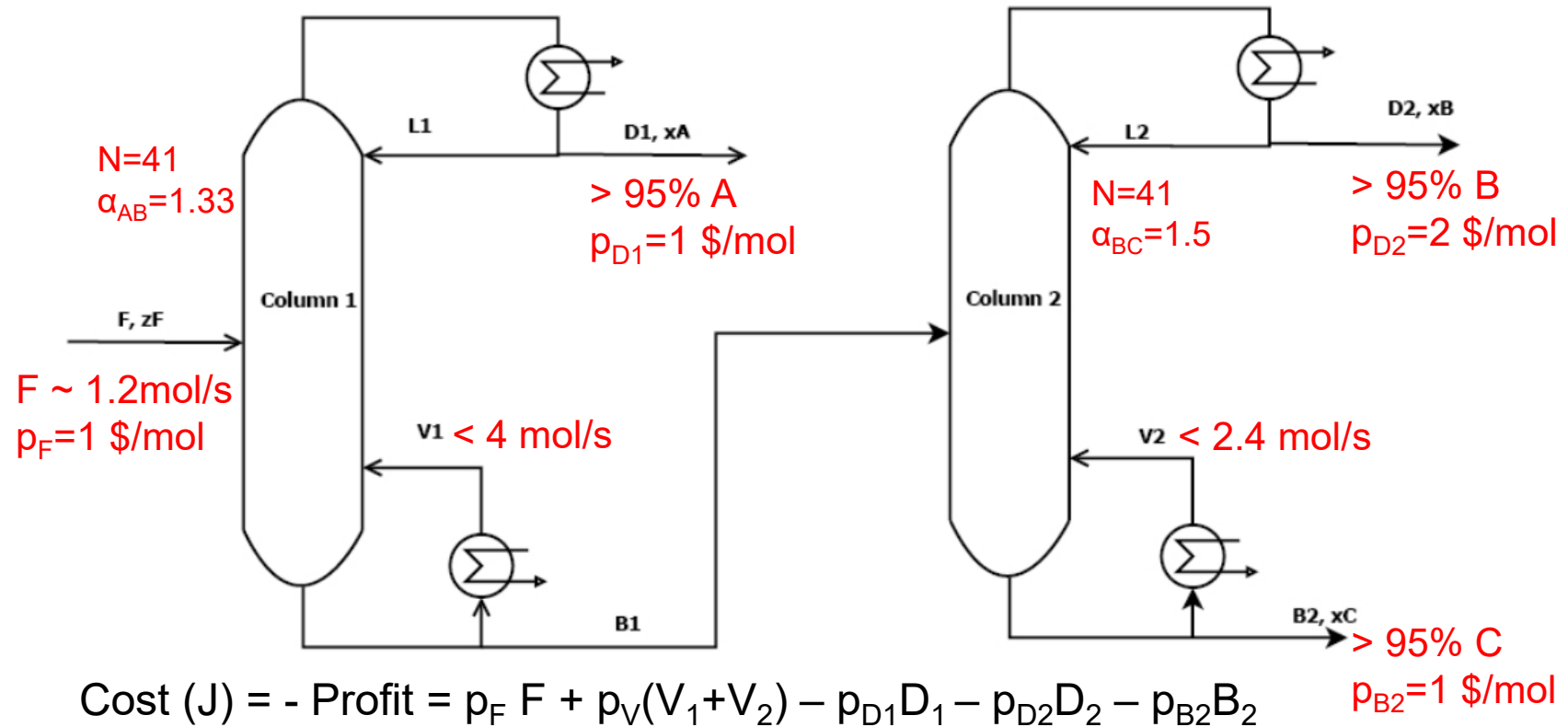
Control implications:

1. ALWAYS Control valuable product at spec. (active constraint)
2. May overpurify (not control) cheap product



Operation of distillation columns in series

With given feed and pressures (disturbances): 4 steady-state DOFs
(e.g., L and V in each column)

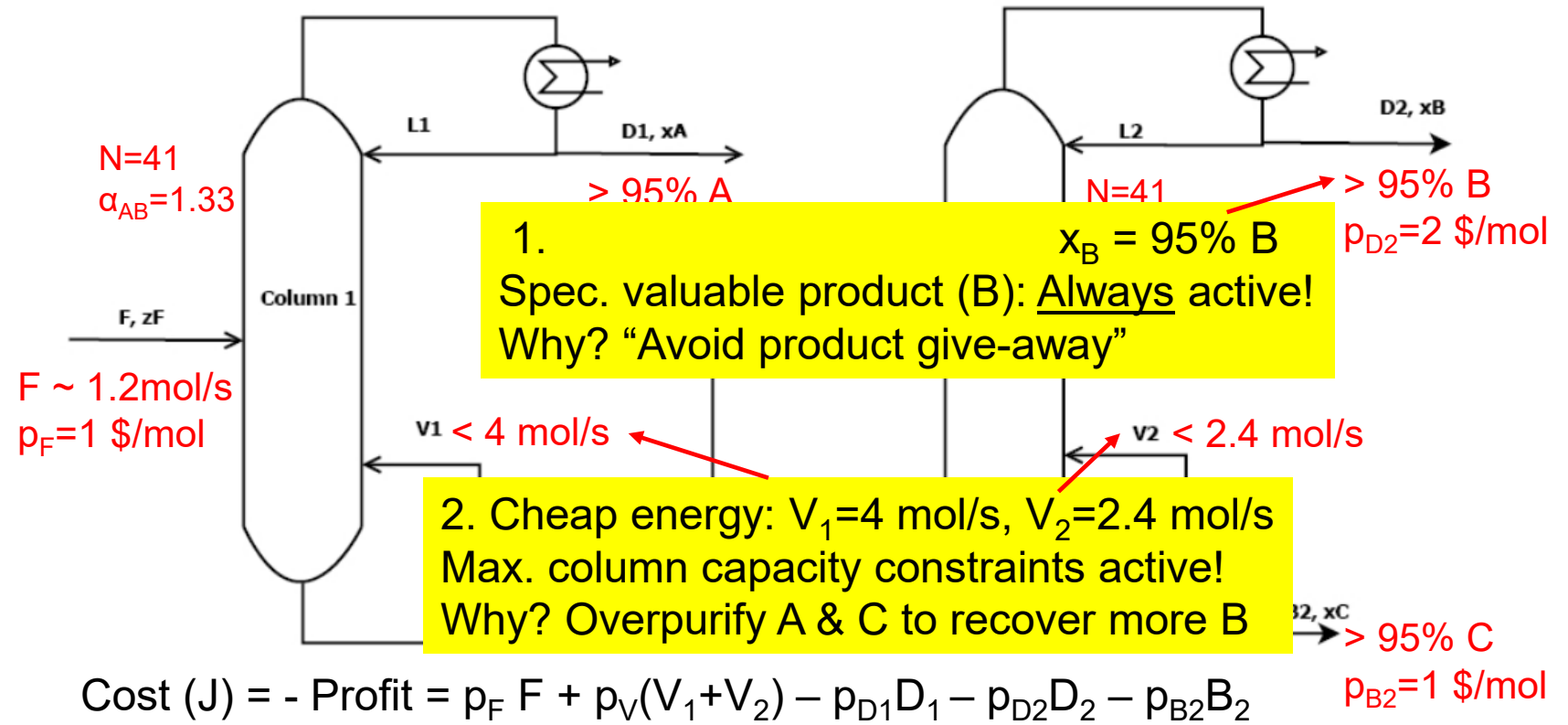


Energy price: $p_V=0-0.2 \text{ \$/mol}$ (varies)

QUIZ: What are the expected active constraints?
1. Always. 2. For low energy prices.

Operation of distillation columns in series

With given feed and pressures (disturbances): 4 steady-state DOFs
(e.g., L and V in each column)



1. Spec. valuable product (B): Always active!
Why? "Avoid product give-away"

2. Cheap energy: $V_1=4 \text{ mol/s}$, $V_2=2.4 \text{ mol/s}$
Max. column capacity constraints active!
Why? Overpurify A & C to recover more B

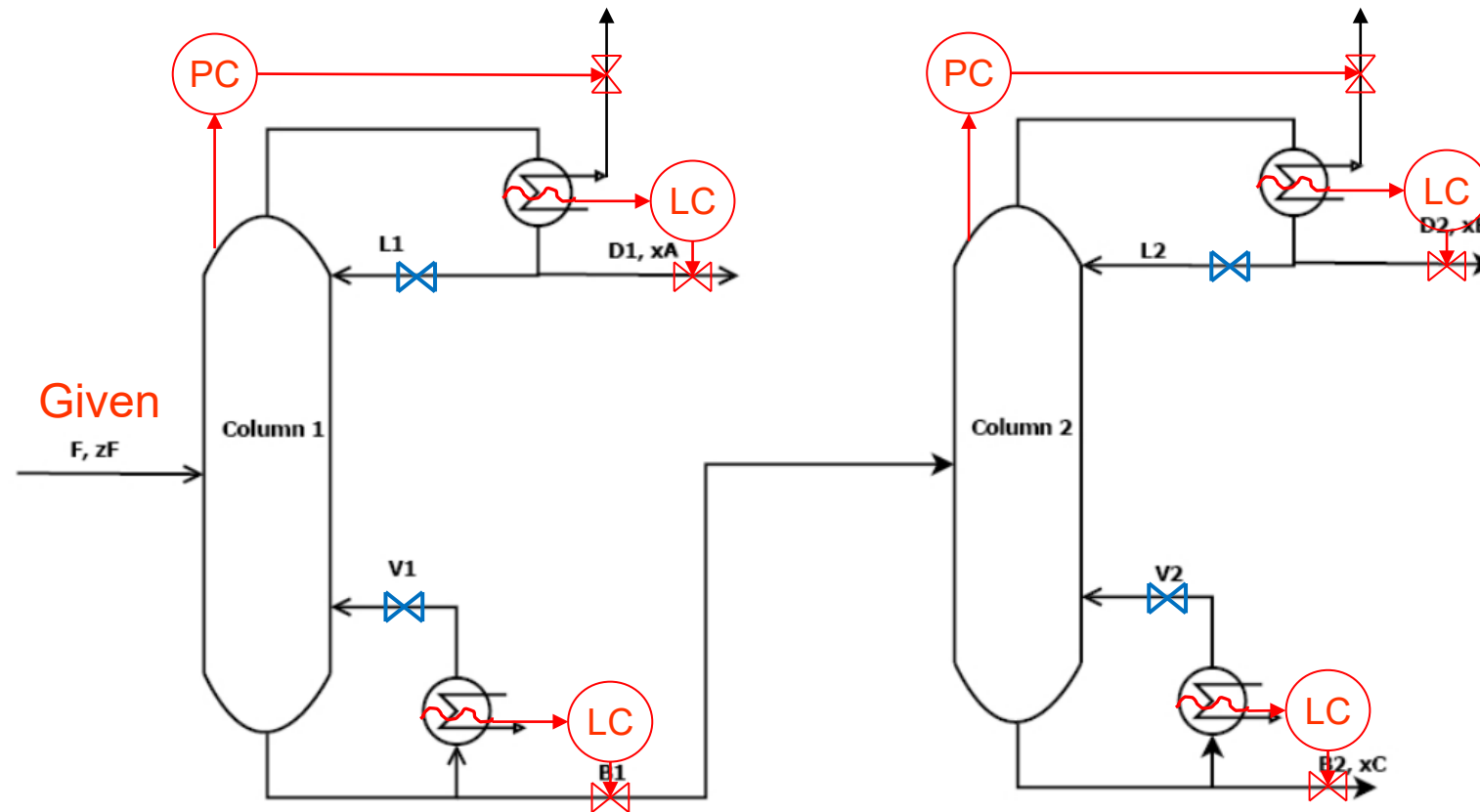
$$\text{Cost (J)} = - \text{Profit} = p_F F + p_V(V_1+V_2) - p_{D1}D_1 - p_{D2}D_2 - p_{B2}B_2$$

Energy price: $p_V=0-0.2 \text{ \$/mol}$ (varies)

QUIZ: What are the expected active constraints?
1. Always. 2. For low energy prices.

DOF = Degree Of Freedom
Ref.: M.G. Jacobsen and S. Skogestad (2011)

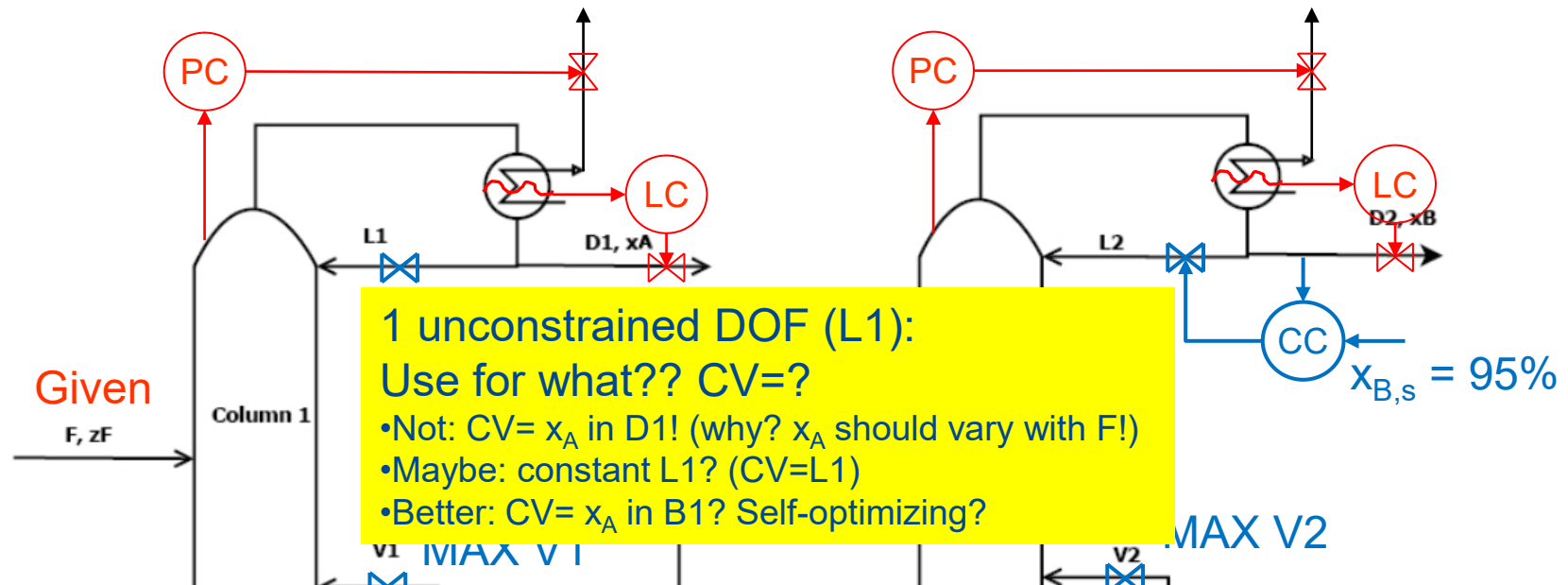
Control of distillation columns in series



Red: Basic regulatory loops

QUIZ. Assume low energy prices ($p_V=0.01$ \$/mol).
 How should we control the columns?
 HINT: CONTROL ACTIVE CONSTRAINTS

Control of distillation columns in series

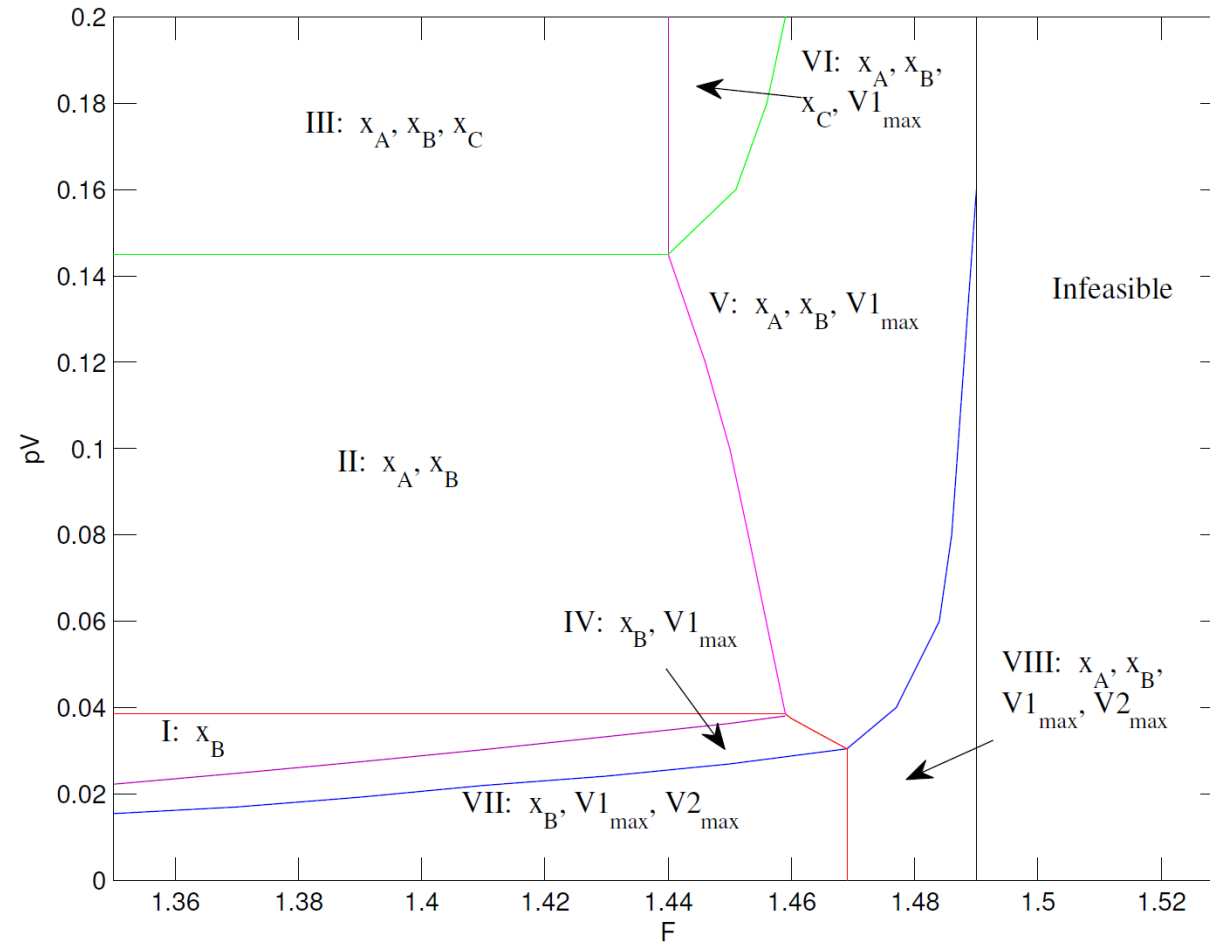
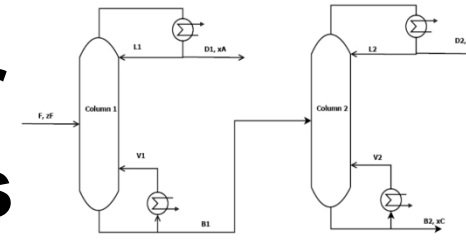


General for remaining unconstrained DOFs:
 LOOK FOR "SELF-OPTIMIZING" CVs = Variables we can keep constant
 WILL GET BACK TO THIS!

QUIZ. Assume low energy prices ($p_v=0.01$ \$/mol).
 How should we control the columns?
 HINT: CONTROL ACTIVE CONSTRAINTS

Red: Basic regulatory loops

Active constraint regions for distillation columns in series



How many active constraints regions?

- Maximum: 2^{n_c}
where n_c = number of constraints

Distillation

$$n_c = 5$$

$$2^5 = 32$$

BUT there are usually fewer in practice

- Certain constraints are always active (reduces effective n_c)
- Only n_u can be active at a given time
 n_u = number of MVs (inputs)
- Certain constraints combinations are not possible
 - For example, max and min on the same variable (e.g. flow)
- Certain regions are not reached by the assumed disturbance set

x_B always active

$$2^4 = 16$$

$$-1 = 15$$

In practice = 8

More on: Optimal operation

$$\min J = \text{cost feed} + \text{cost energy} - \text{value products}$$

Two main cases (modes) depending on market conditions:

Mode 1. Given feed rate

Mode 2. Maximum production (more constrained)

Comment: Depending on prices, Mode 1 may include many subcases (active constraints regions)

Mode 1. Given feedrate

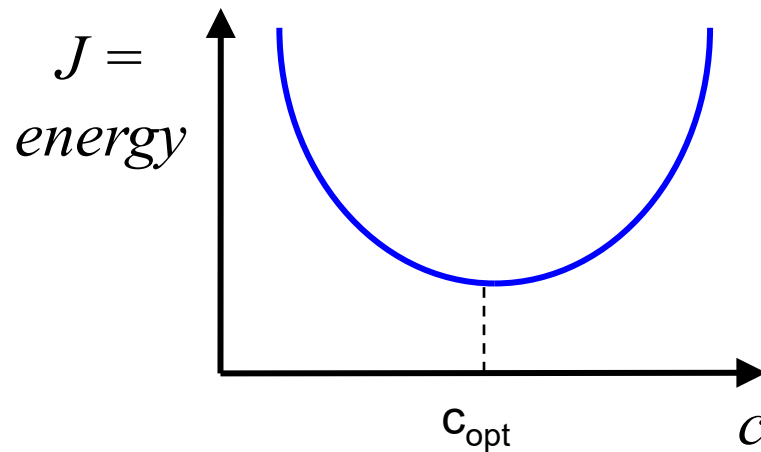
Amount of products is then usually indirectly given and

$$J = \underbrace{\text{cost feed} - \text{value products}}_{\text{Often constant}} + \text{cost energy}$$

Often constant

Optimal operation is then usually *unconstrained*

“maximize efficiency (energy)”



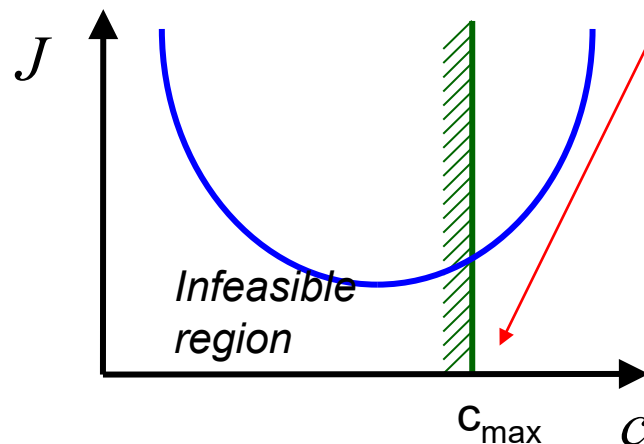
Control:

- Operate at optimal trade-off
- NOT obvious what to control
- CV = Self-optimizing variable

Mode 2. Maximum production

$$J = \text{cost feed} + \text{cost energy} - \text{value products}$$

- Assume feed rate is degree of freedom
- Assume products much more valuable than feed
- Optimal operation is then to maximize product rate
- **“max. constrained”, prices do not matter**

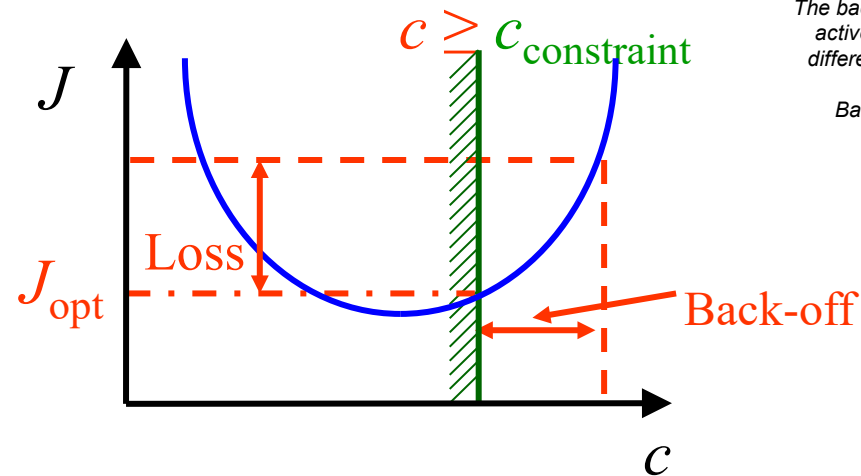


Control:

- Focus on tight control of bottleneck
- “Obvious what to control”
- CV = ACTIVE CONSTRAINT

More on: Active output constraints

Need back-off



The backoff is the “safety margin” from the active constraint and is defined as the difference between the constraint value and the chosen setpoint
 $Backoff = |Constraint - Setpoint|$

- a) If constraint can be violated dynamically (only average matters)
 - **Required Back-off** = “measurement bias” (steady-state measurement error for c)
- b) If constraint cannot be violated dynamically (“hard constraint”)
 - **Required Back-off** = “measurement bias” + maximum dynamic control error

Want tight control of hard output constraints to reduce the back-off. “Squeeze and shift”-rule

Motivation for better control: Squeeze and shift rule

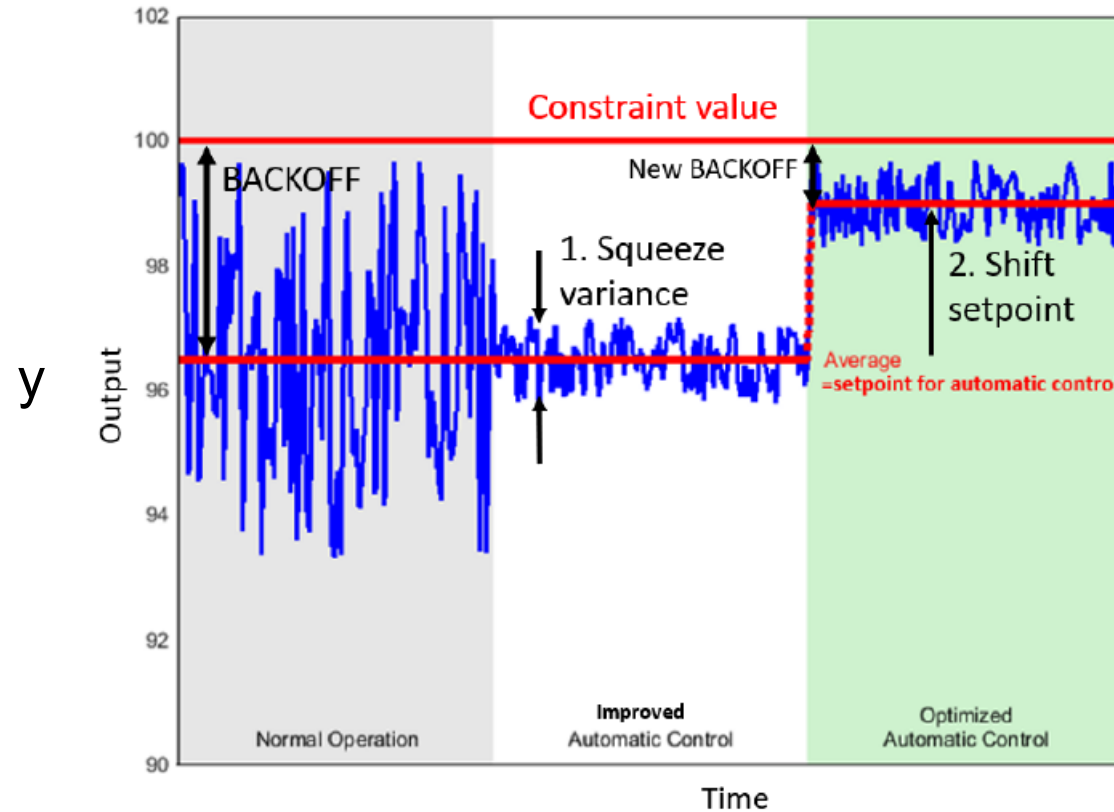
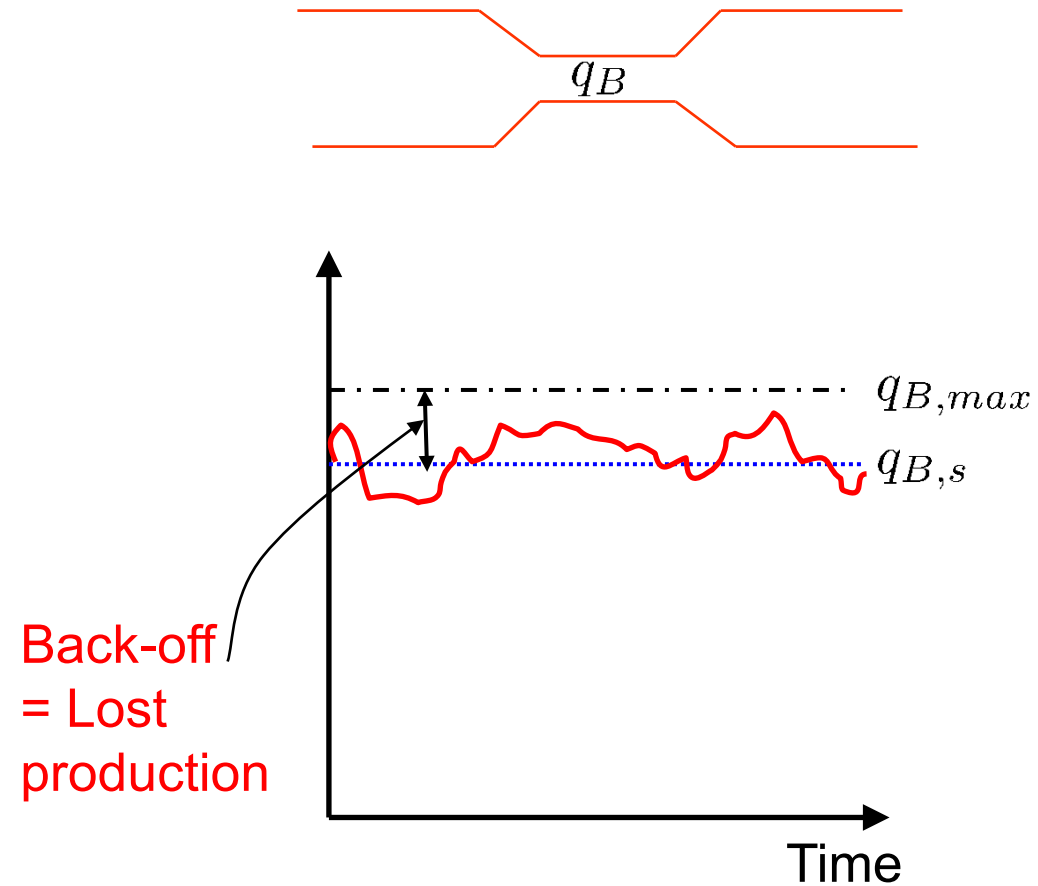


Figure 8: Squeeze and shift rule: Squeeze the variance by improving control and shift the setpoint closer to the constraint (i.e., reduce the backoff) to optimize the economics (Richalet et al., 1978).

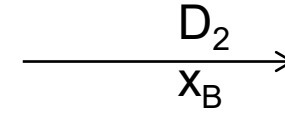
Example: max. throughput.

Want tight bottleneck control to reduce backoff!



Example: purity on distillate

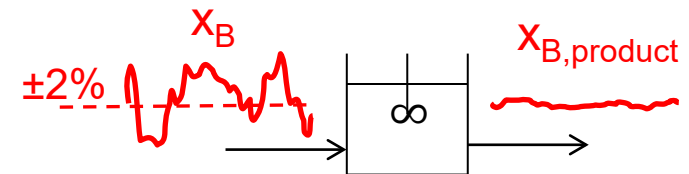
x_B = purity of product > 95% (min.)



- D_2 directly to customer (**hard** constraint)
 - Measurement error (bias): 1%
 - Control error (variation due to poor control): 2%
 - Backoff = 1% + 2% = 3%
 - Setpoint $x_{B_s} = 95 + 3\% = 98\%$ (to be safe)
 - Can reduce backoff with better control (“squeeze and shift”)

- D_2 to large mixing tank (**soft** constraint)

- Measurement error (bias): 1%
- Backoff = 1%
- Setpoint $x_{B_s} = 95 + 1\% = 96\%$ (to be safe)
- Do not need to include control error because it averages out in tank



Unconstrained optimum

Control “self-optimizing” variable!

- Which variable is best?
- Often not obvious (marathon runner)

What are good self-optimizing variables?

1. Optimal value of CV is constant
2. CV is “sensitive” to MV (large gain)

Conclusion optimal operation

ALWAYS:

1. Control active constraints and control them tightly!!
 - Good times: Maximize throughput → tight control of bottleneck
2. Identify “self-optimizing” CVs for remaining unconstrained degrees of freedom
 - Use offline analysis to find expected operating regions and prepare control system for this!
 - One control policy when prices are low (nominal, unconstrained optimum)
 - Another when prices are high (constrained optimum = bottleneck)

ONLY if necessary: consider RTO on top of this