

# Lecture 2: Model Building Framework

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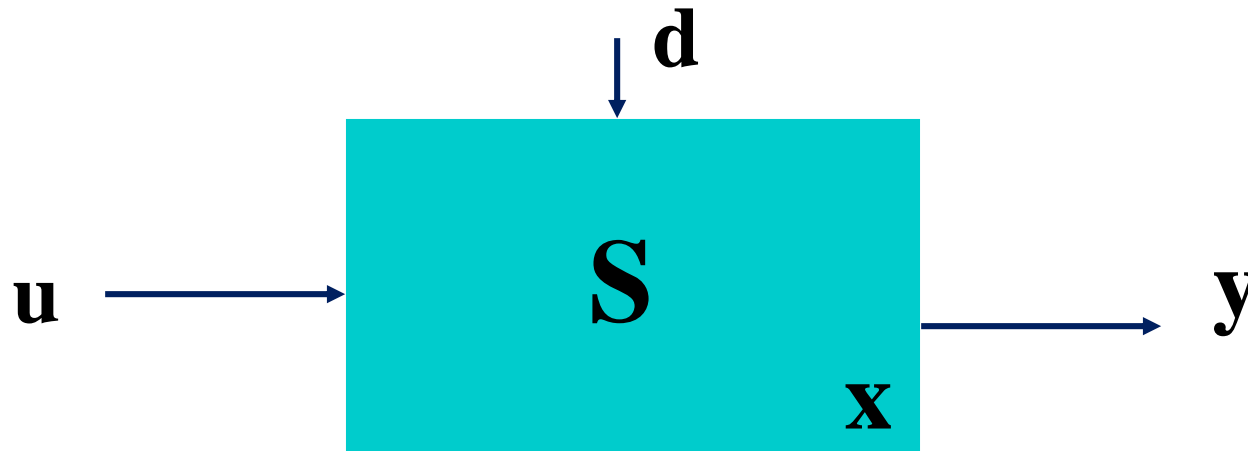
# This lecture consists of 3 parts

- ❖ Modelling framework (lecture 2)
- ❖ Conservation principles (lecture 2a)
- ❖ Constitutive & conditional models (lecture 2b)

# Overview: Lecture 2

- ❖ The process system (SISO, MISO, MIMO)
- ❖ The modelling goal
- ❖ A systematic approach
- ❖ The necessary ingredients

# The Process System



❖ Inputs,  $u$

❖ Outputs,  $y$

❖ States,  $x$

❖ Disturbances,  $d$

$$y = S[u,d]$$

(SISO, MIMO  
SS or dynamic)

# The Modelling Goal

## □ Application areas

### ❖ Flowsheeting

- ◆ simulation (rating)
- ◆ design
- ◆ optimization

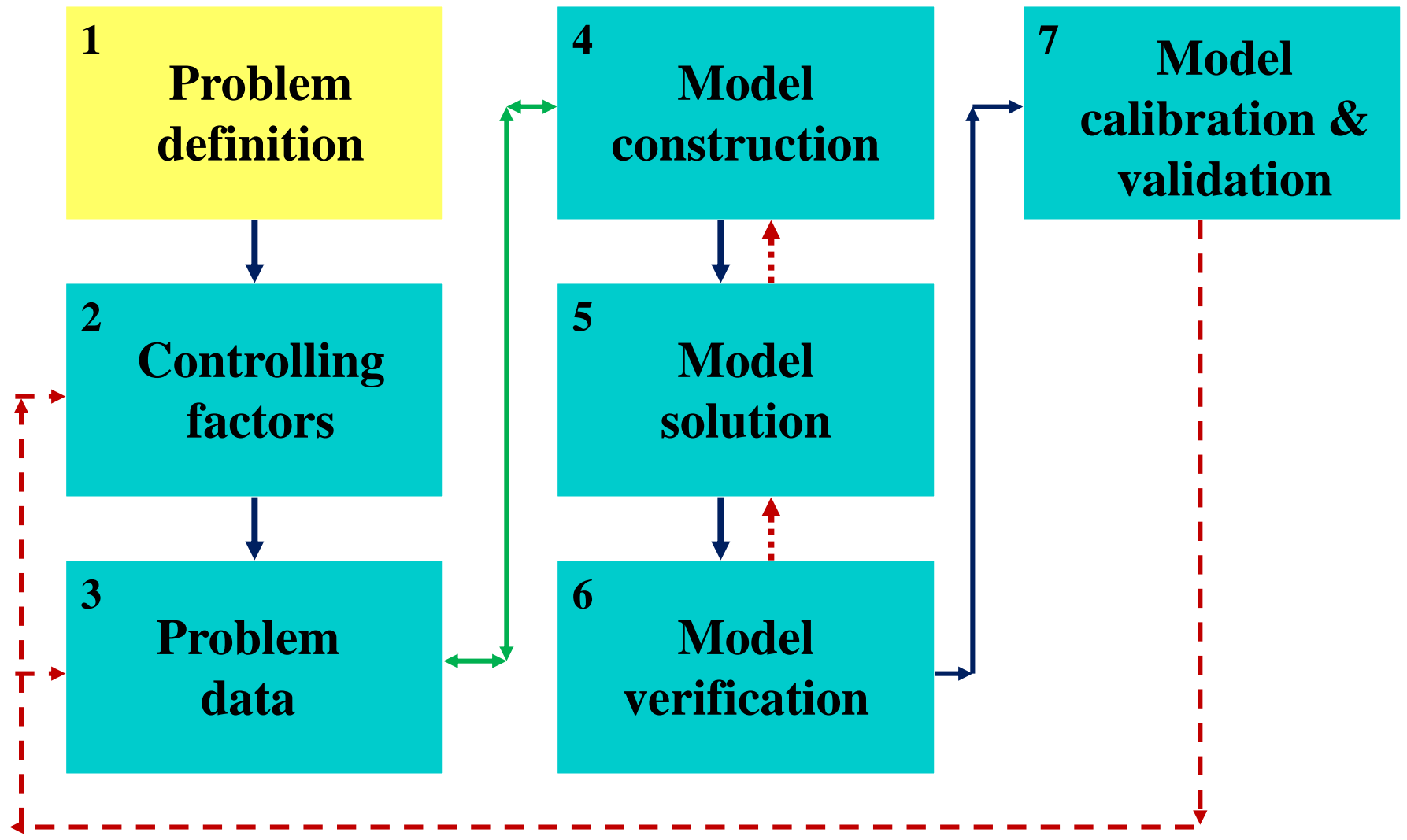
### ❖ Process control/analysis

- ◆ prediction
- ◆ regulation
- ◆ identification
- ◆ diagnosis

## □ Performance specifications

- real, integer or Boolean indices

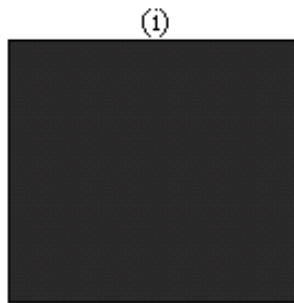
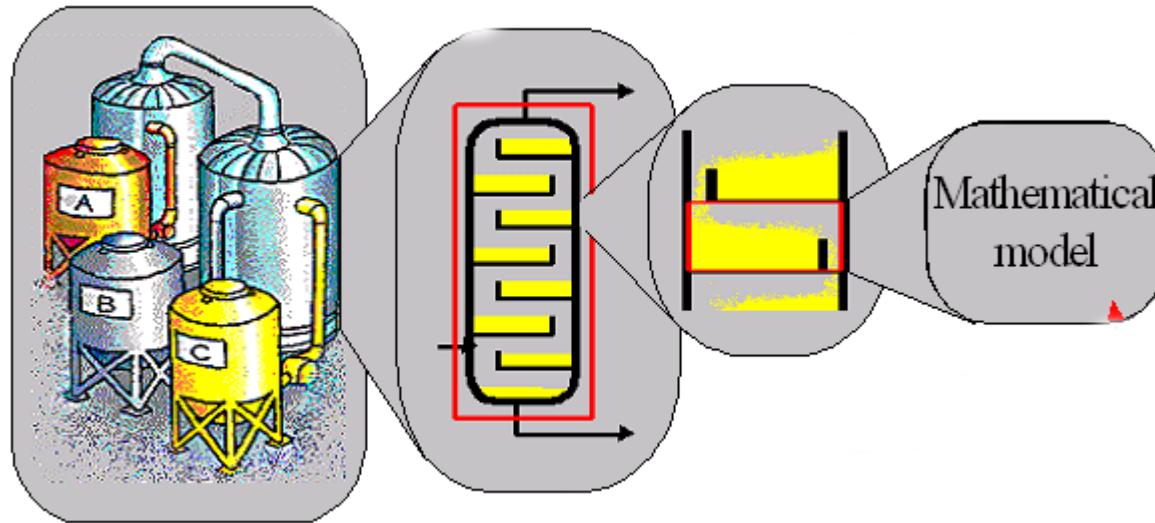
# A Systematic Modelling Procedure



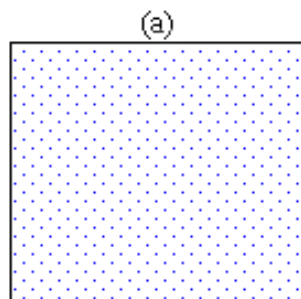
# 1. Problem Definition

- ❖ Clear description of system
  - ◆ establish underlying assumptions
- ❖ Statement of modelling intention
  - ◆ intended goal or use
  - ◆ acceptable error
  - ◆ anticipated inputs/disturbances

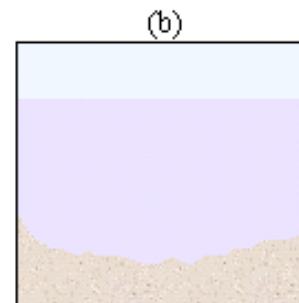
# 1. Problem Definition



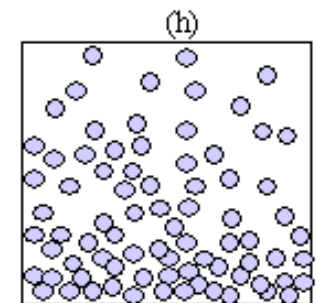
Black box



Perfectly mixed system



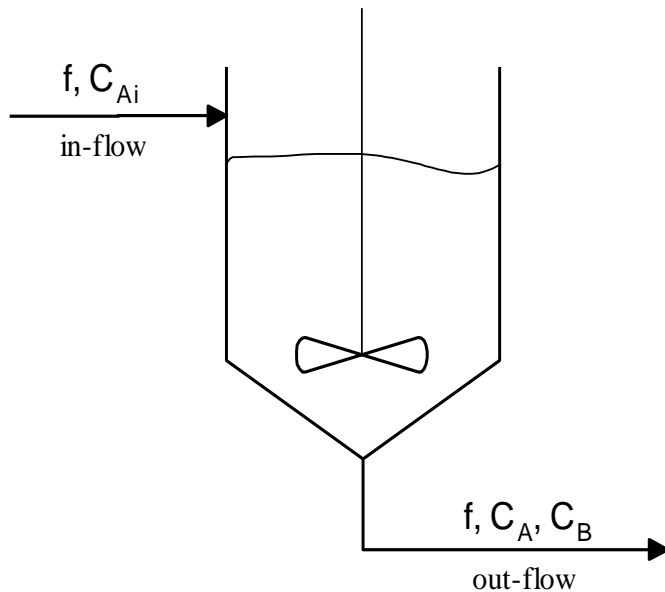
Equilibrium phase system



Particulated system with uniform gradient in one direction



# Definition Example (Step 1)



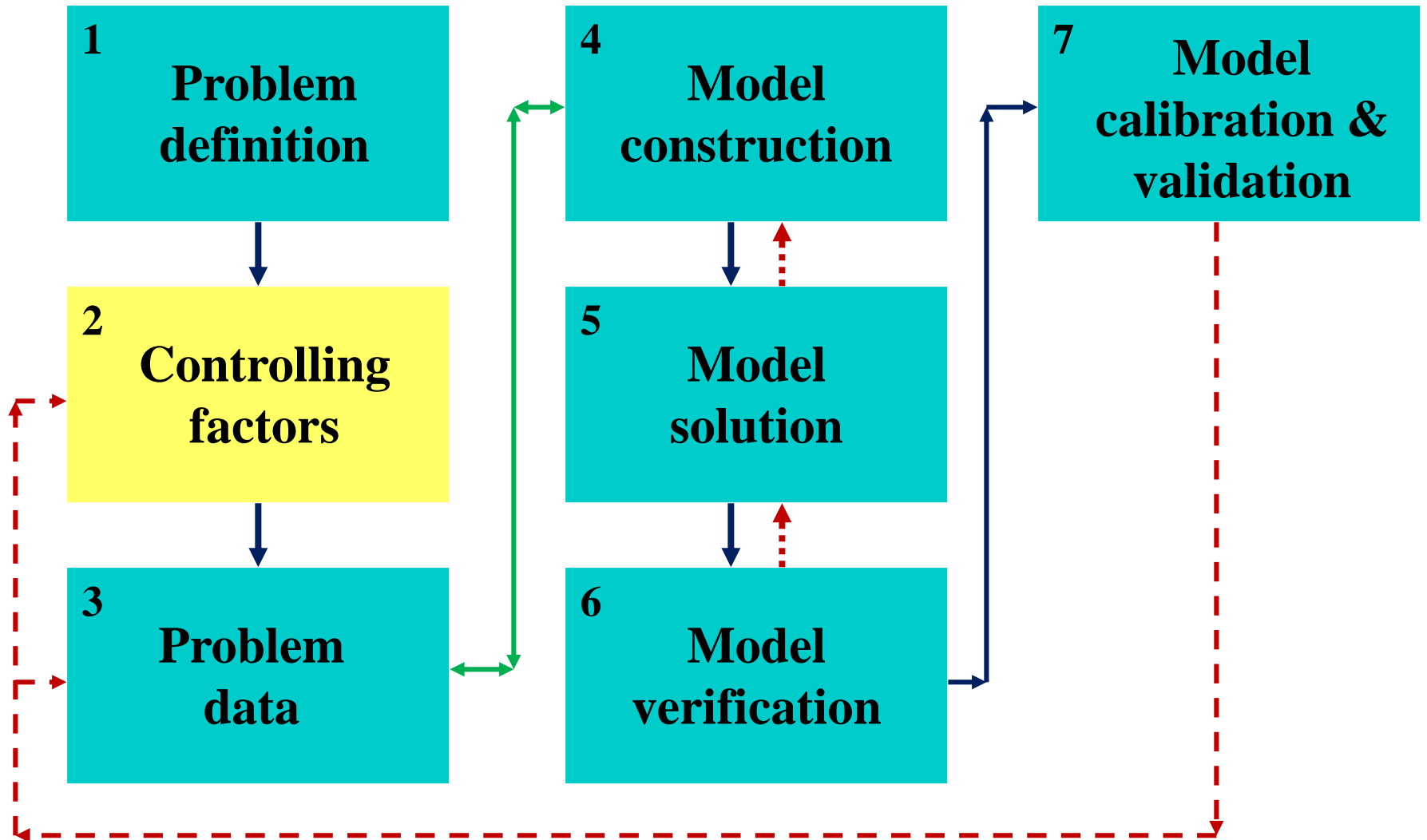
## ❖ Goal (intent)

- ◆ effect of inlet change
- ◆ study dynamic behavior (control design)
- ◆ +/-10% accuracy

## ❖ CSTR description

- ◆ process/system details
- ◆ lumped ? - **yes**
- ◆ dynamic? - **yes**

# A Systematic Modelling Procedure



## 2. Controlling Factors / Mechanisms

- ❖ Chemical reaction

- ❖ Mass transfer

  - ◆ convective, evaporative,

    - ...

- ❖ Heat transfer

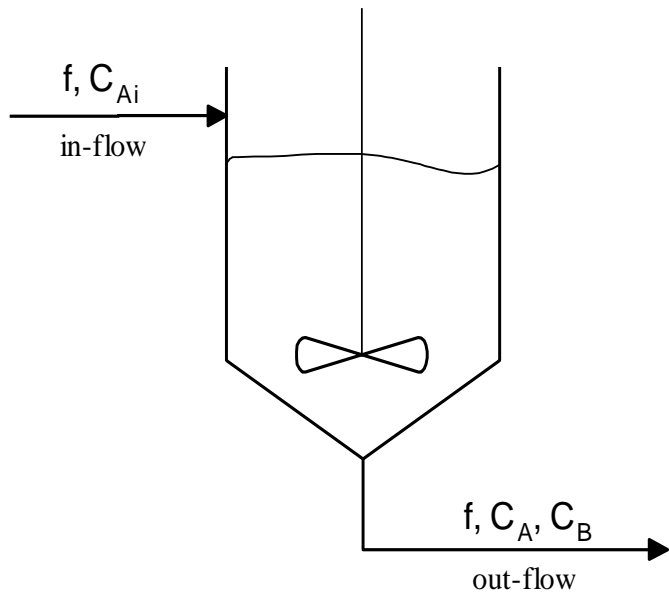
  - ◆ radiative, conductive, ...

- ❖ Momentum transfer



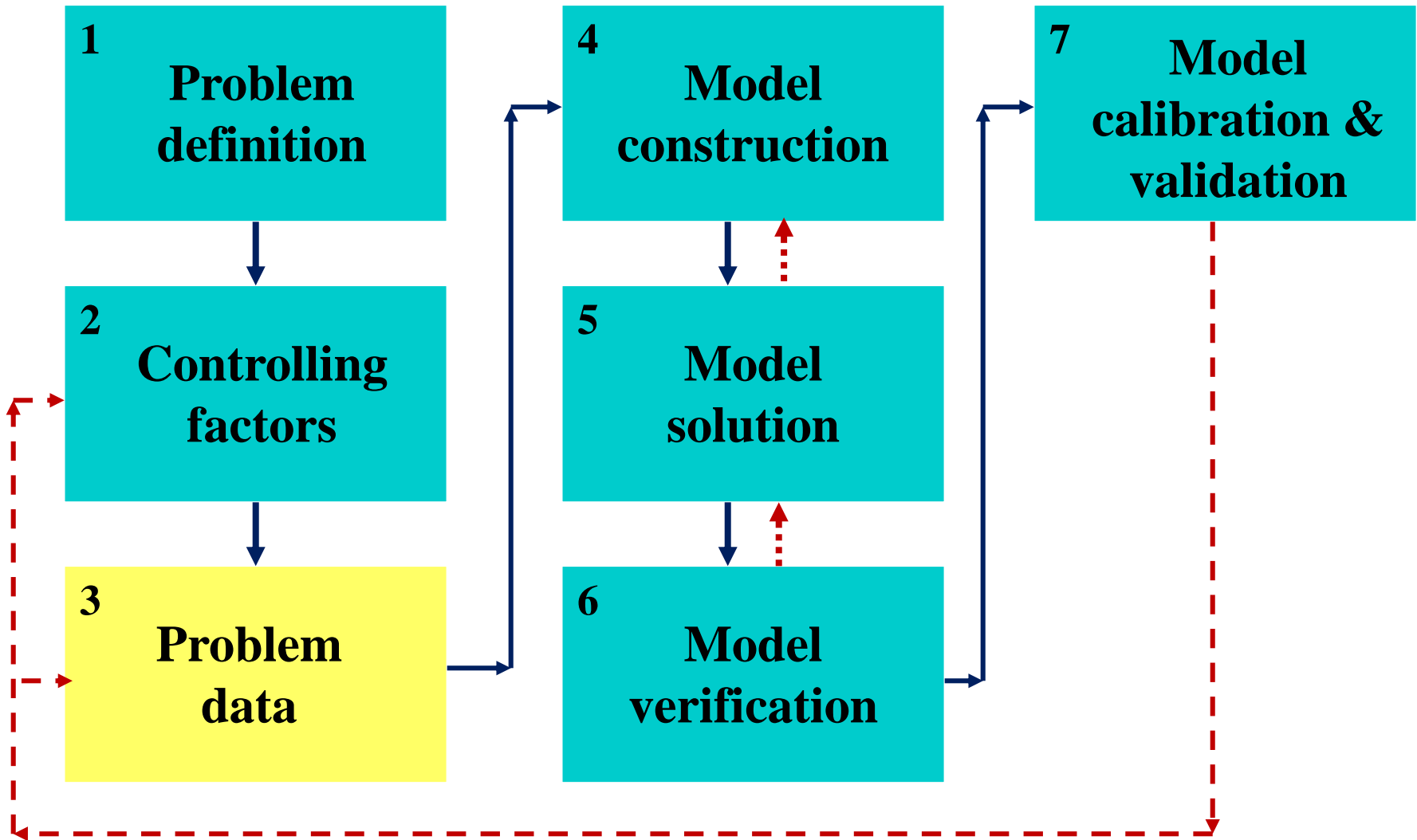
ASSUMPTIONS

# Mechanisms - CSTR (step 2)

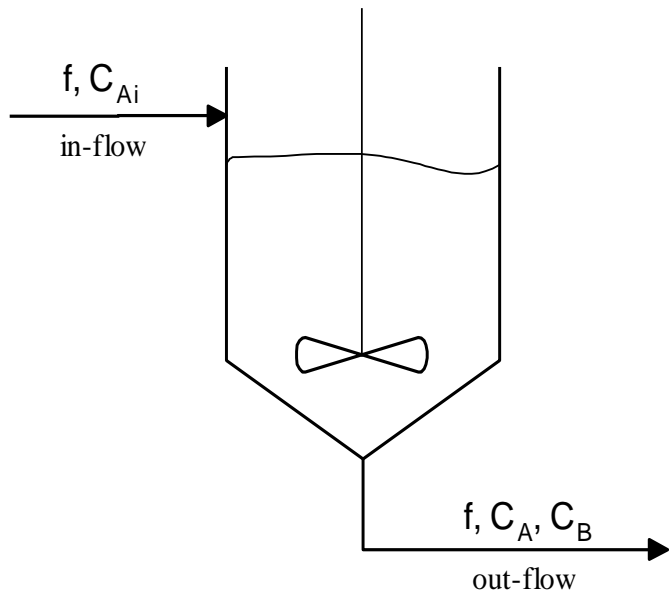


- ❖ Chemical reaction  
 $A \rightarrow B$
- ❖ Perfect mixing
- ❖ No heat loss or supplied (adiabatic)

# A Systematic Modelling Procedure

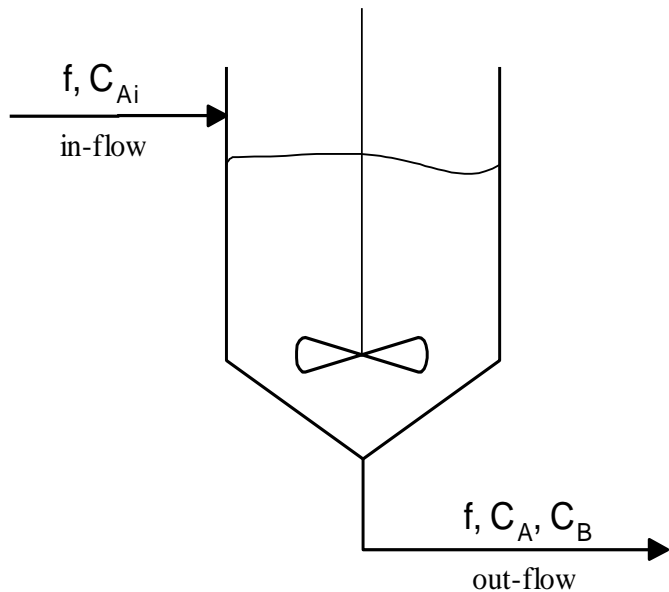


## 3. Data for the problem



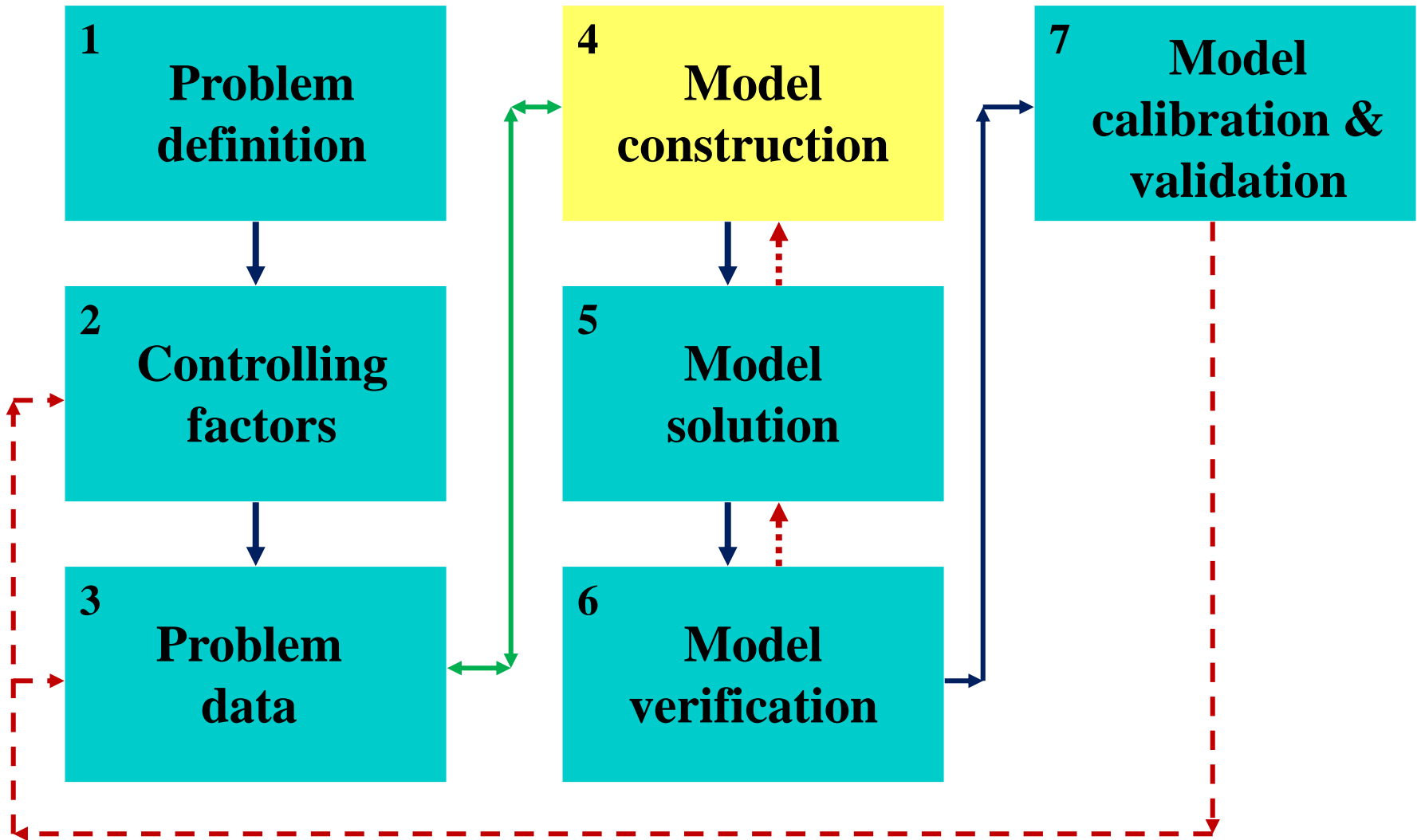
- ❖ Physico-chemical data
- ❖ Reaction kinetics
- ❖ Equipment parameters
- ❖ Plant (process) data

# Data needs: Example - CSTR (step 3)



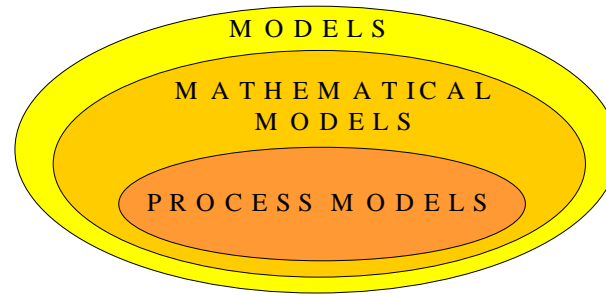
- ❖ Reaction kinetics data:  $k_0, E, \Delta H_R$
- ❖ Physico-chemical properties
  - ◆ specific heats, enthalpies, ...
- ❖ Equipment parameters:  $V$

# A Systematic Modelling Procedure





# Model Construction Steps



- ❖ **Derive the model equations**
- ❖ **Analyze model equations**
- ❖ **Translate the model equations to a solvable form; create library for use with a simulator or for on-line solution**

*A computer aided system assists the user in performing the above tasks*

# 4. Model construction

- ❖ **Assumptions**
- ❖ **Boundaries and balance volumes**
- ❖ **Conservation equations**
  - ◆ mass
  - ◆ energy
  - ◆ momentum
- ❖ **Constitutive equations**
  - ◆ reaction rates
  - ◆ transfer rates
  - ◆ property relations
  - ◆ balance volume relations
  - ◆ control relations & equipment constraints
- ❖ **Conditions**
  - ◆ **Equilibrium; control; defined relations; initial conditions; boundary conditions**

## **Classification of Variables**

**Known** (Defined by system (parameters); Defined by problem; Independent )

**Unknown** (state, dependent)

# CSTR Model (step 4)

## ❖ Assumptions

- ◆ A1: perfect mixing
- ◆ A2: first order reaction
- ◆ A3: adiabatic operation
- ◆ A4: equal inflow, outflow
- ◆ A5: constant properties

### Equations analysis:

8 equations: 2 ODEs; 6 AEs

## ❖ Equations

### ◆ conservation

$$\frac{dm_A}{dt} = f_{A_i} - f_A - rV \quad \text{mass}$$

$$\frac{dH}{dt} = f\hat{H}_i - f\hat{H} \quad \text{energy}$$

### ◆ constitutive

$$r = k_0 e^{-\frac{E}{RT}} C_A \quad \text{Reaction rate}$$

$$m_A = C_A V \quad \text{Defined relations for mass, enthalpy and flow}$$

$$\hat{H}_i = c_p T_i$$

$$\hat{H} = c_p T$$

$$f_{A_i} = f C_{A_i}$$

$$f_A = f C_A$$

# CSTR Model (step 4)

❖ Classification of variables (plus degree of freedom analysis:  **$D_F=18$  variables – 8 equations = 10**)

◆ Known (parameters)  $R, k_0, E, \Delta H_R, c_p$  **5**

◆ Known (defined)  $V, f, C_{Ai}, T_i$  **4**

◆ Known (independent)  $t$  **1**

◆ Unknown  $M_A, H, r, C_A, T, \hat{H}_i, f_{Ai}, f_A$  **2+6**

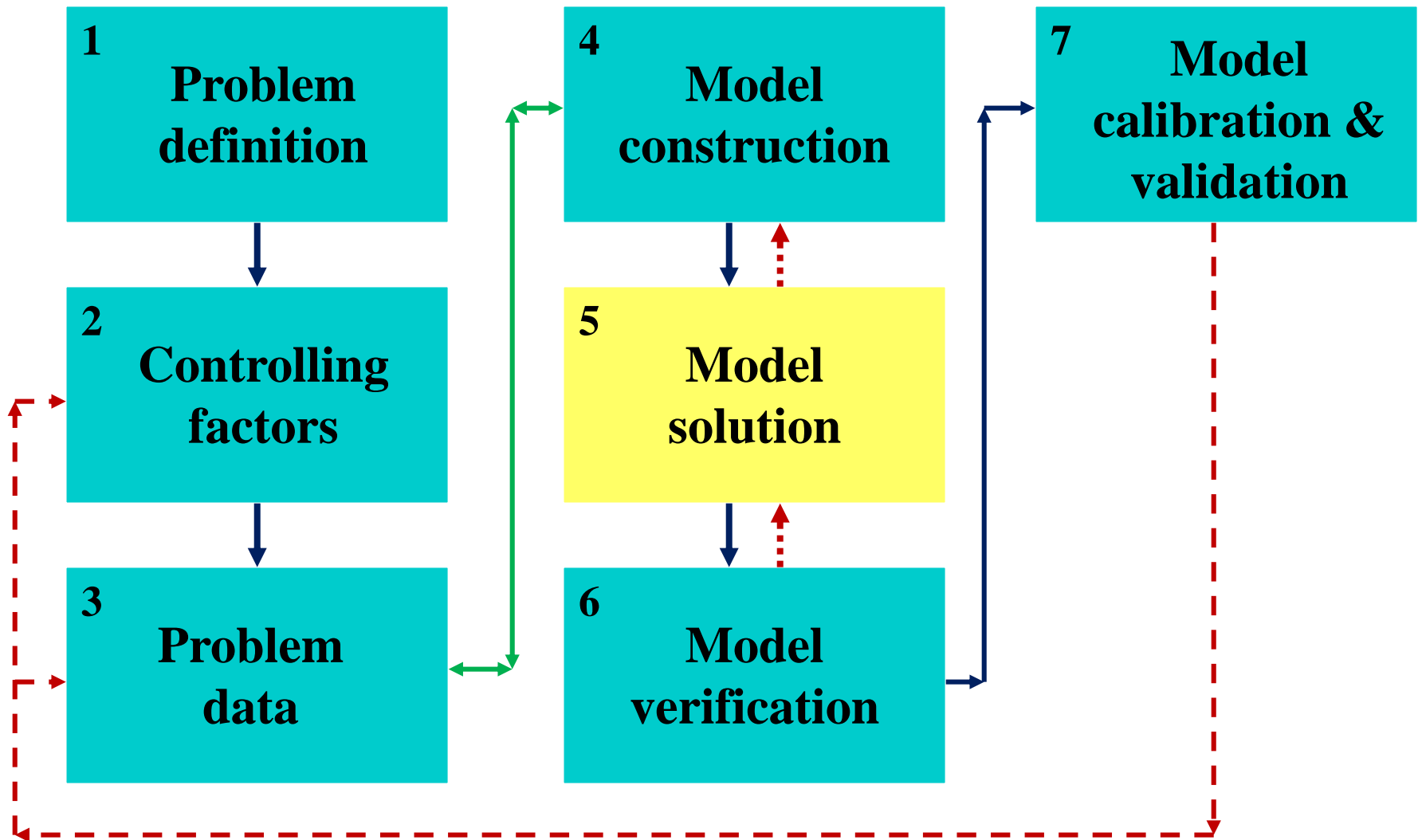
❖ Boundary Conditions

$$C_A(0) = C_{Ai}$$

$$T(0) = T_i$$

Two differential equations need **initial conditions** for two dependent variables

# A Systematic Modelling Procedure



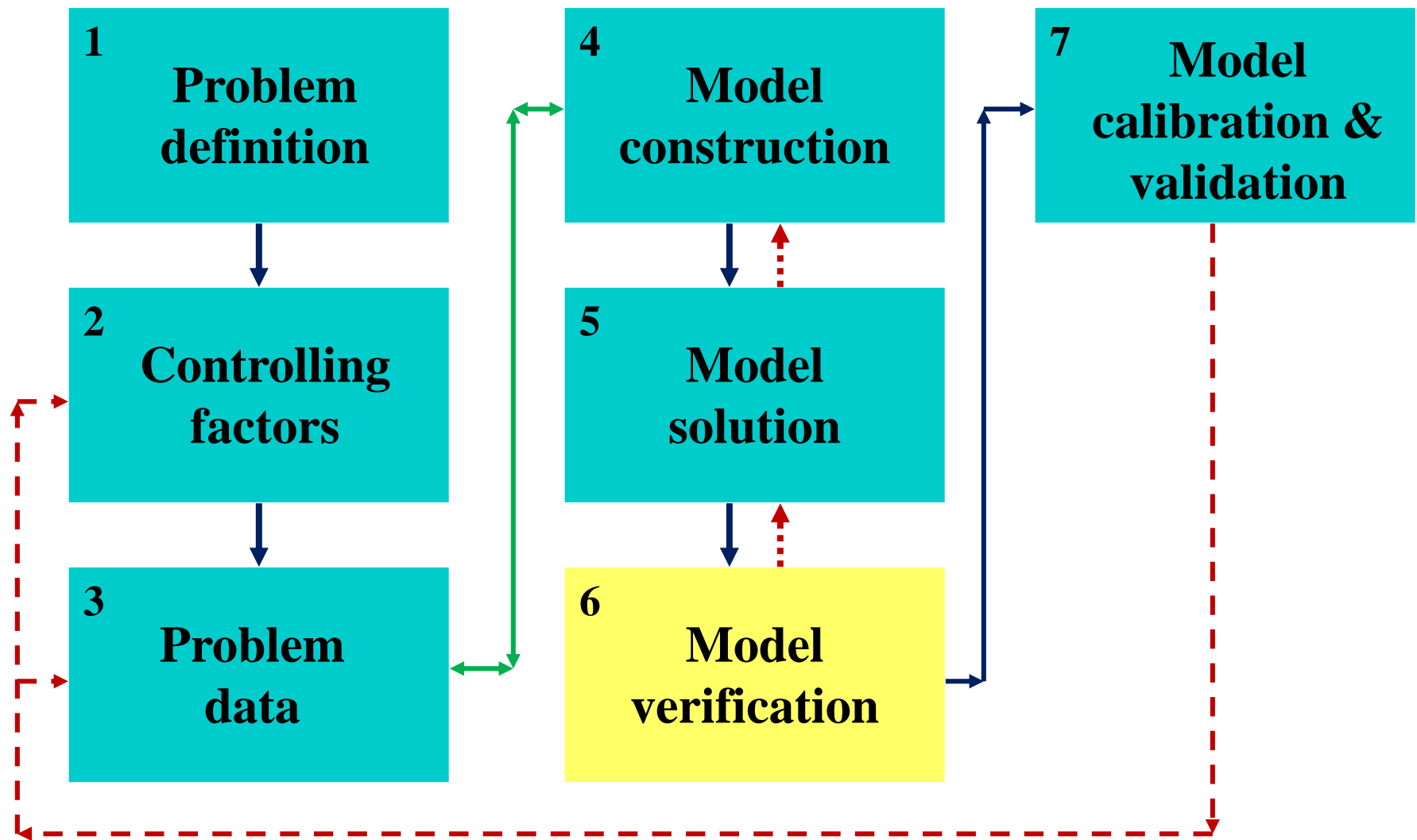
## 5. Model solution

- ❖ Algebraic systems
- ❖ Ordinary differential equations
- ❖ Differential-algebraic equations
- ❖ Partial differential equations
- ❖ Integro-partial differential equations

# CSTR - Numerical Solution (step 5)

- ❖ Solution of differential-algebraic equations
  - ◆ using structuring techniques
  - ◆ using direct DAE solution

# A Systematic Modelling Procedure

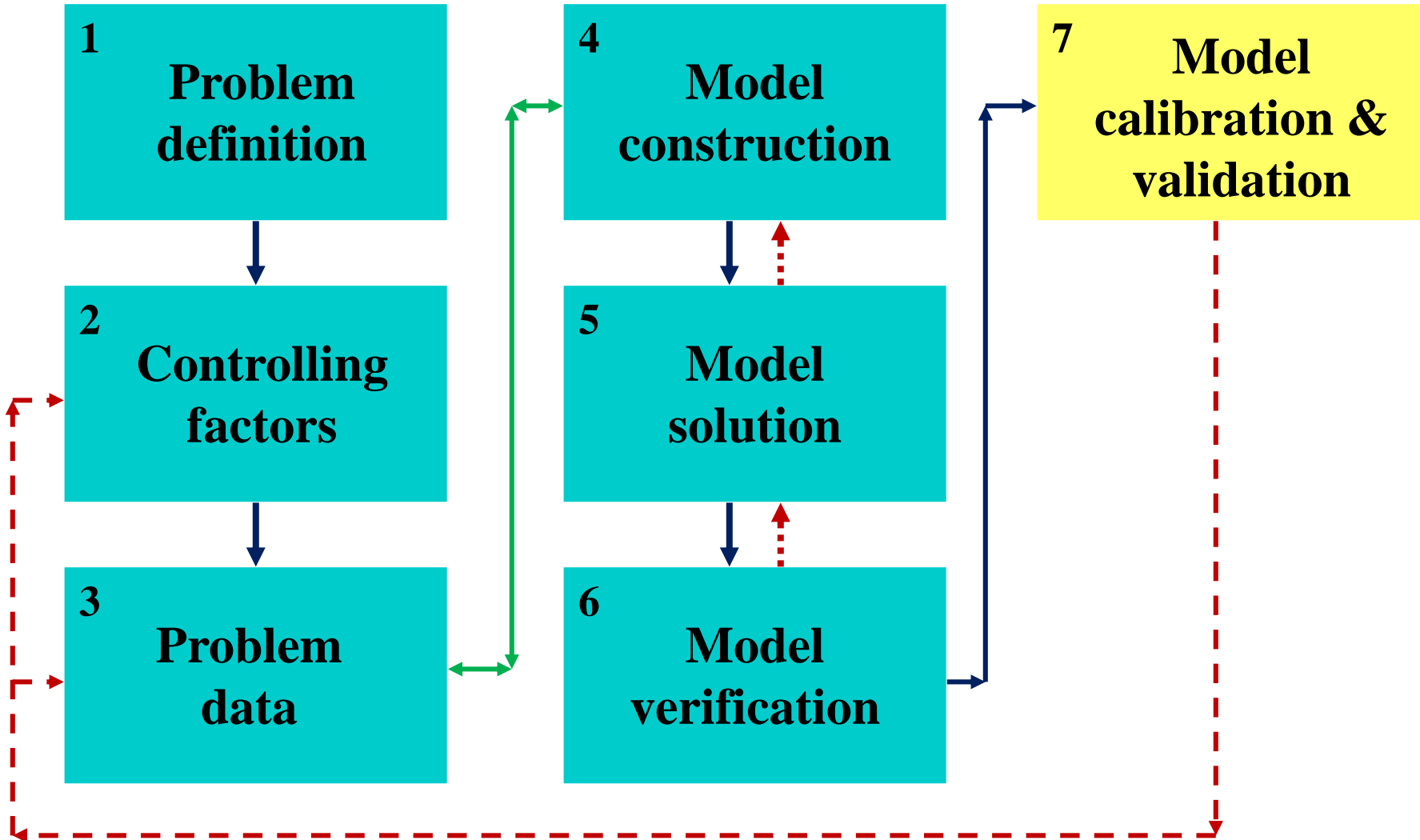




## 6. Model verification

- ❖ Structured programming approach
- ❖ Modular code
- ❖ Testing of separate modules
- ❖ Exercise all code logic
  - ◆ conditions
  - ◆ Constraints
- ❖ Quality documentation

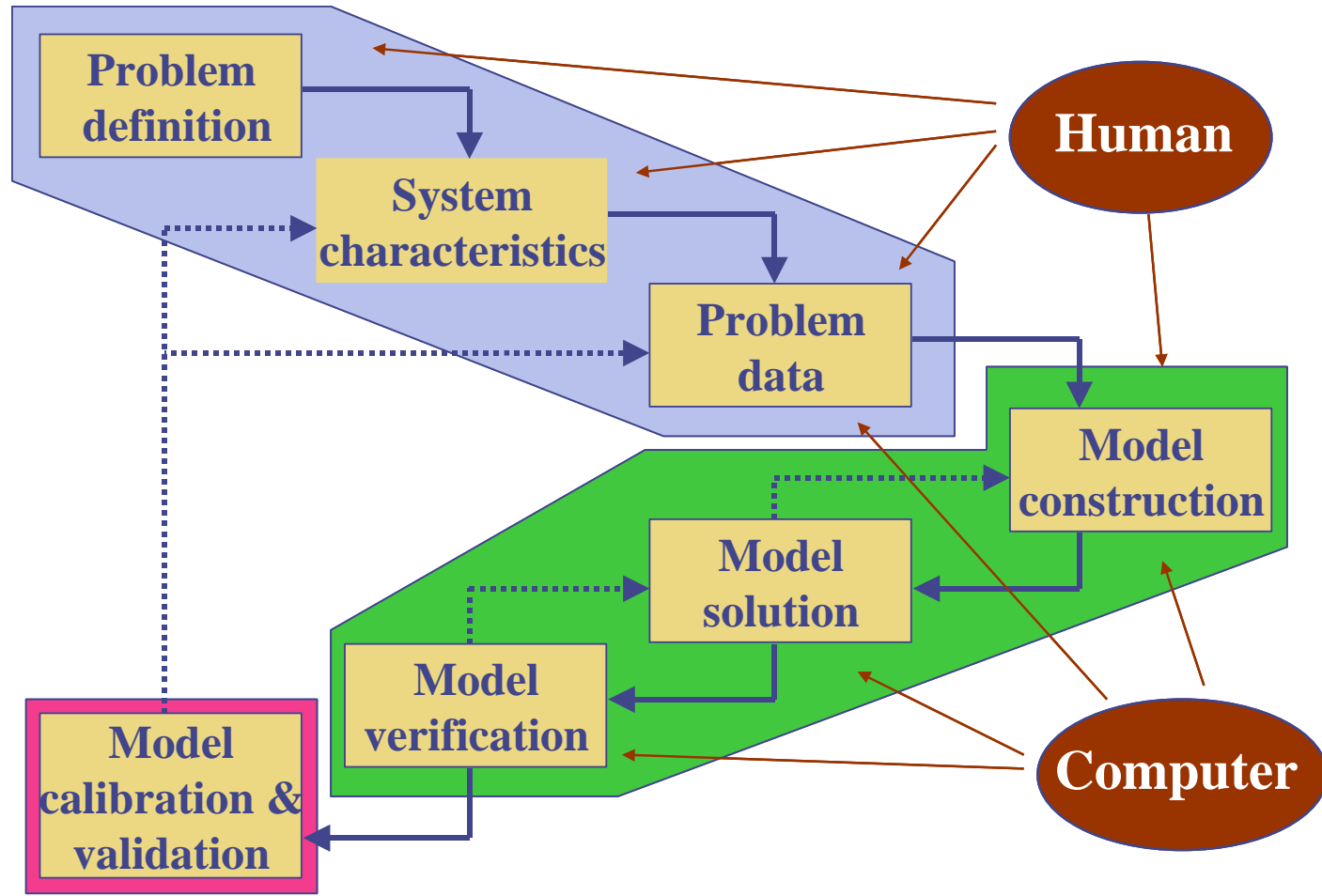
# A Systematic Modelling Procedure



## 7. Model calibration/validation

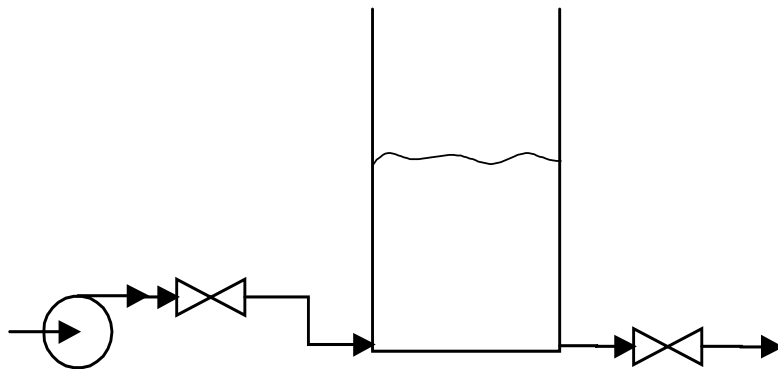
- ❖ Generate plant data
- ❖ Analyze plant data for quality
- ❖ Parameter or structure estimation
- ❖ Independent hypothesis testing for validation
- ❖ Revise the model until suitable for purpose

# Systematic Computer Aided Modelling System

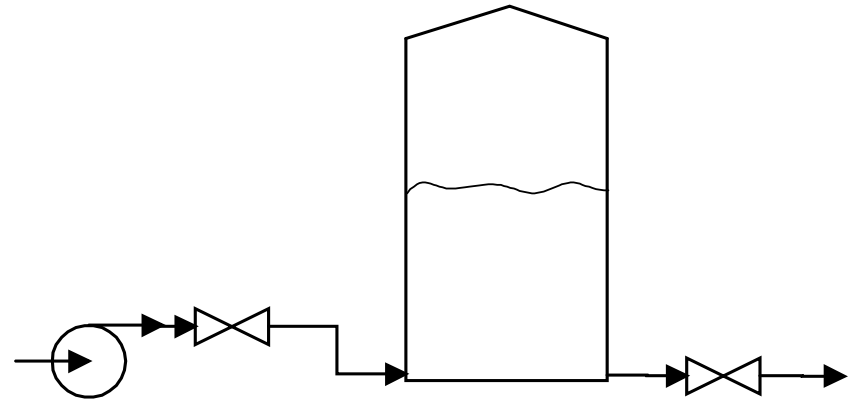


# Modelling exercise - 1

For the open & closed tank systems shown below, develop the appropriate models

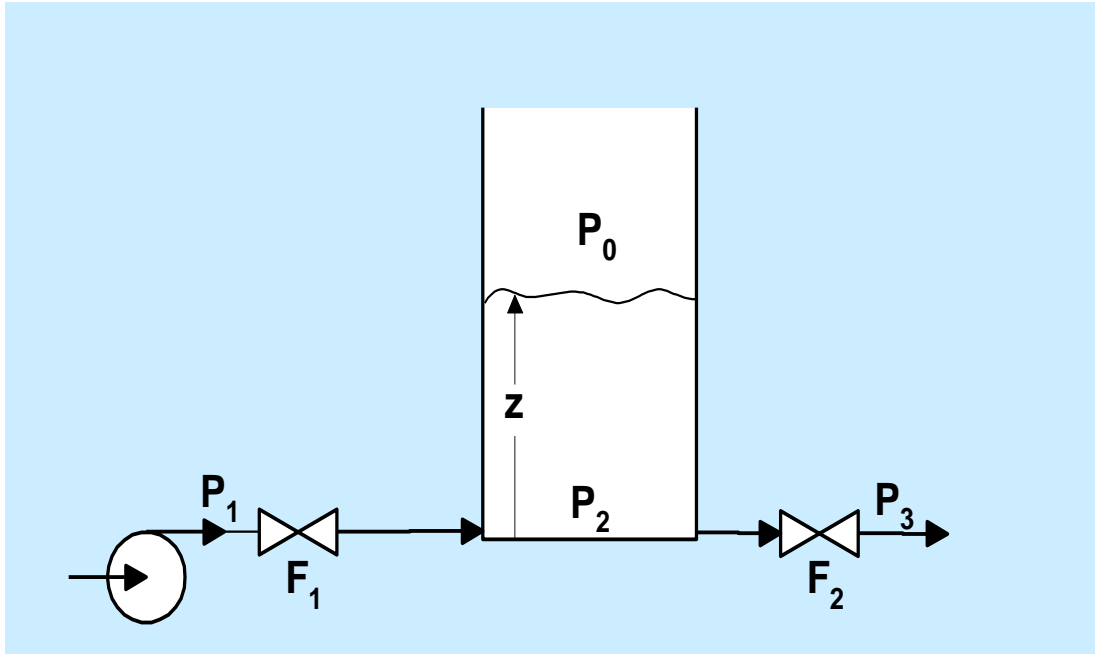


**Open system**



**Closed system**

# A Process Example



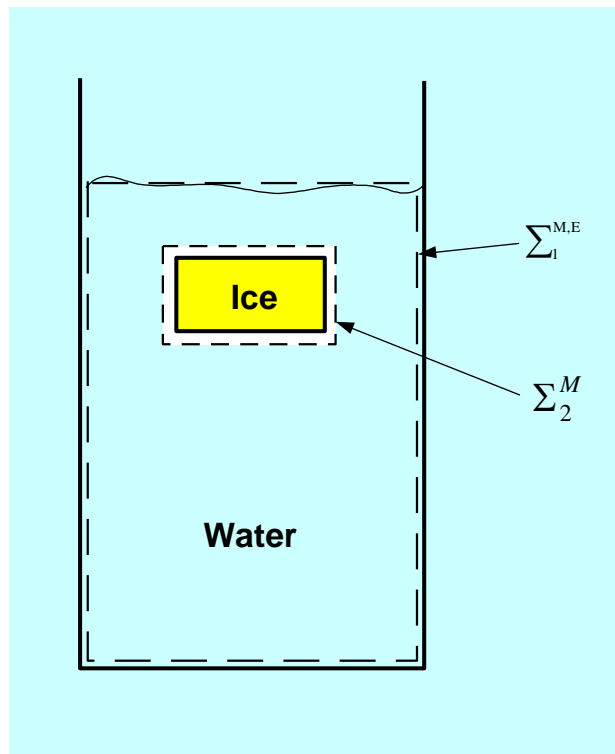
$$\frac{dz}{dt} = \frac{(F_1 - F_2)}{A}$$

$$F_1 - C_V \sqrt{P_1 - P_2} = 0$$

$$F_2 - C_V \sqrt{P_2 - P_3} = 0$$

$$P_2 - P_0 - \rho g z = 0$$

# Modelling exercise – 2a: Melting of ice cube



```
#Conservation equation
#*****
#Mass balance
dMice = -m
dMwater = m

#Energy balance
dTw = -q / (Mwater*cpwater)
```

```
Constitutive equations
#*****
m = q/L
```

$$q = h \cdot A \cdot (T_w - T_{ice})$$

$$A = 6 \cdot (M_{ice} / \rho_{ice})^{2/3}$$

```
L = heat of vaporization (energy/mass)
h = heat transfer coefficient
[energy/(temperature*area)]
A = area of ice cube
```

# Lecture 2a: Conservation Principles

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# Overview of lecture 2a

- ❖ Thermodynamic system principles
- ❖ Balance volumes in process systems
- ❖ Extensive and intensive variables
- ❖ Principle of conservation
- ❖ Conservation equations
- ❖ Induced algebraic equations

# Principle of Conservation

## ❖ Word form

$$\left\{ \begin{array}{l} \text{net change} \\ \text{of quantity} \end{array} \right\} = \left\{ \begin{array}{l} \text{flow into} \\ \text{system} \end{array} \right\} - \left\{ \begin{array}{l} \text{flow out} \\ \text{of system} \end{array} \right\} + \{ \text{generation} \} - \{ \text{consumption} \}$$

## ❖ Integral equation form

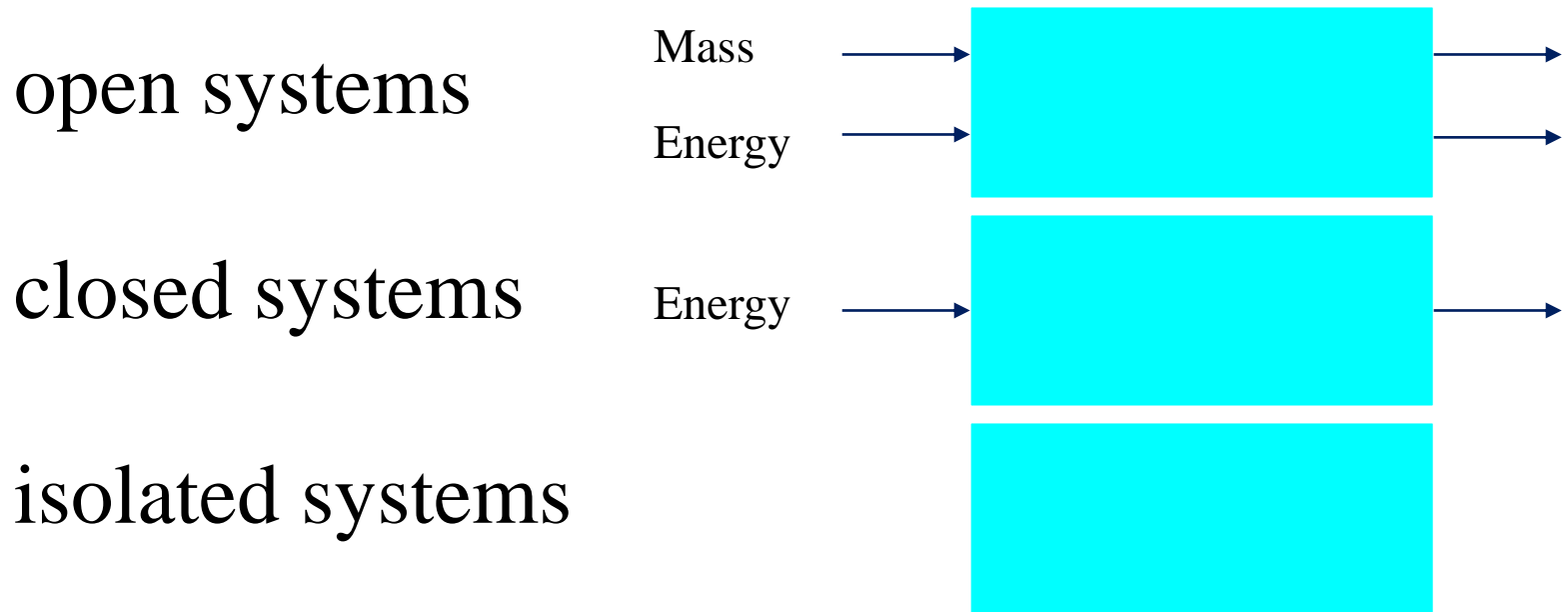
$$\frac{d}{dt} \left\{ \int_V \hat{\Phi}(r, t) dv \right\} = - \oint_F J(r, t) \cdot n_F(r) df + \int_V \hat{q}(r, t) dv$$

## ❖ Differential form (rectangular coordinates)

$$\frac{\partial \hat{\Phi}}{\partial t} = D \left( \frac{\partial^2 \phi}{\partial x^2} + \frac{\partial^2 \phi}{\partial y^2} + \frac{\partial^2 \phi}{\partial z^2} \right) - \left( \frac{\partial \hat{\Phi}}{\partial x} v_x + \frac{\partial \hat{\Phi}}{\partial y} v_y + \frac{\partial \hat{\Phi}}{\partial z} v_z \right) + \hat{q}$$

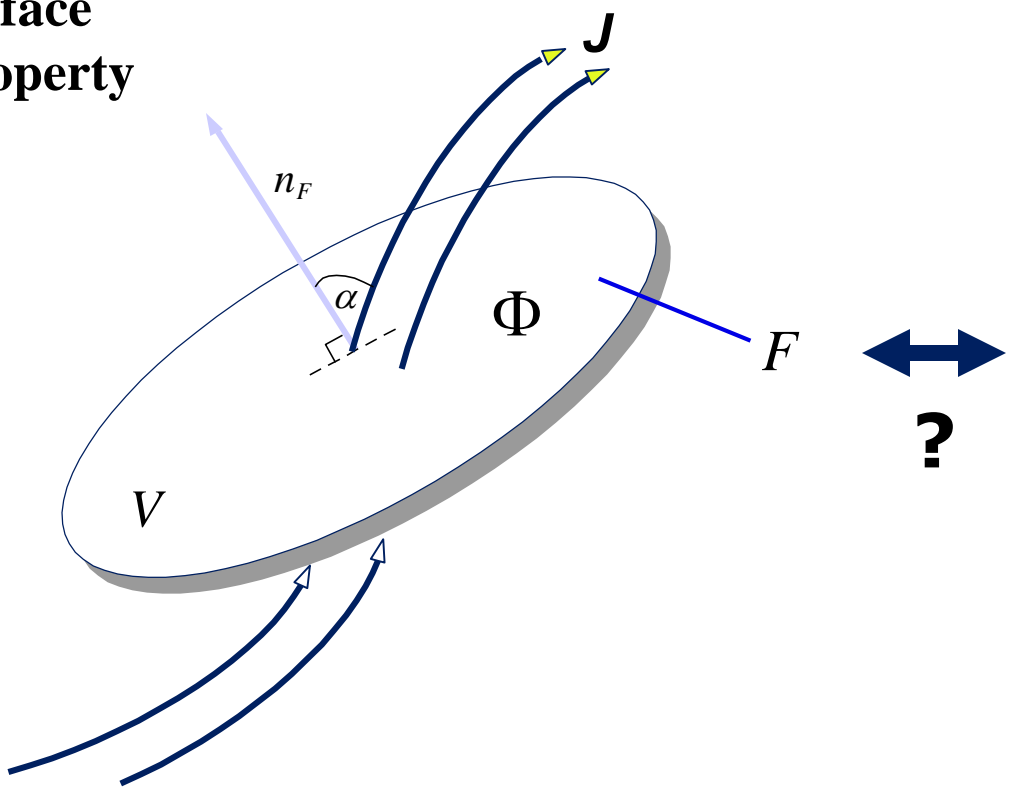
# Thermodynamic system principles

## Spaces and their characteristics



# Balance or “Control” Volumes

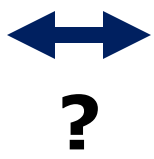
**V**: volume  
**F**: surface  
 $\phi$  : property



General principle



Copper converter

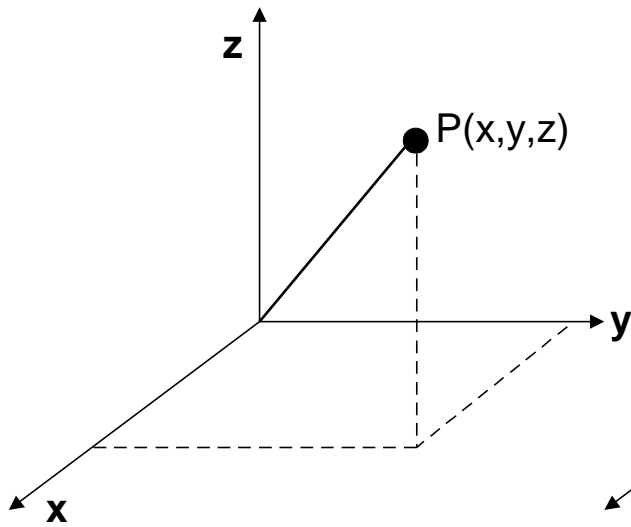


Gas compressor  
Particular application

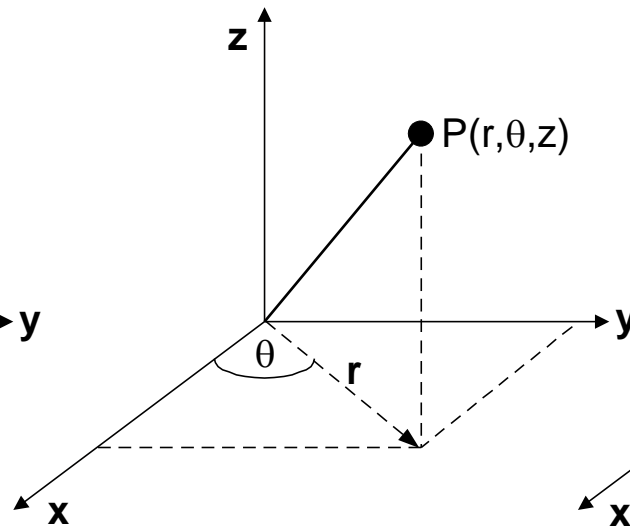
# Balance Volumes

- ❖ Defined by physical equipment
- ❖ Defined by distinct phases
- ❖ Dictated by the modelling goal
- ❖ Need for a co-ordinate system
  - rectangular
  - cylindrical
  - spherical

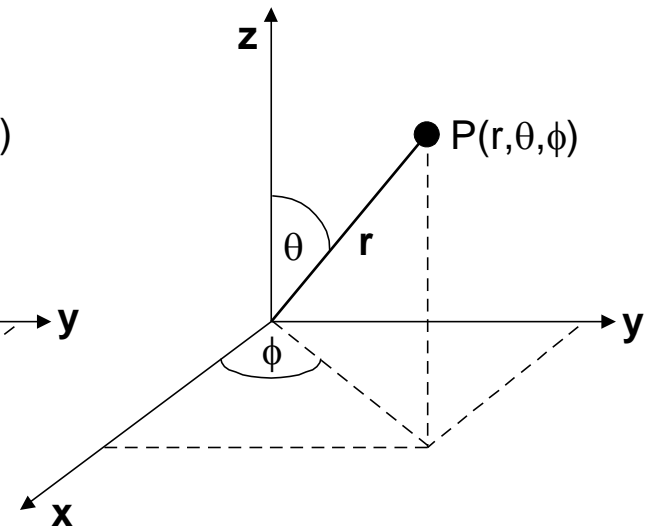
# Principal Co-ordinate Systems



Rectangular



Cylindrical

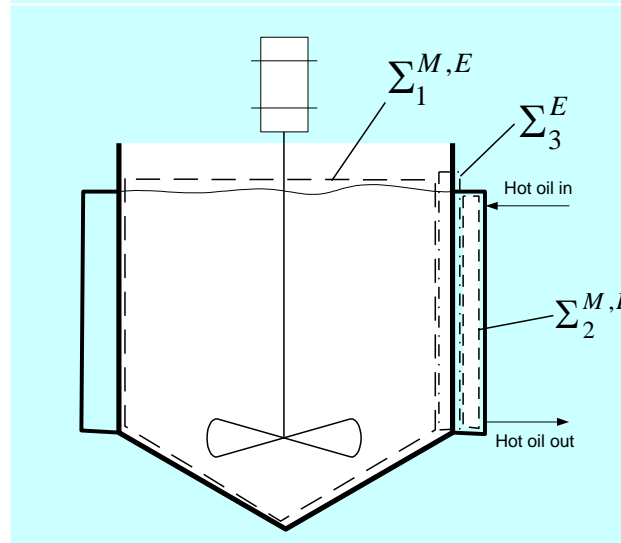
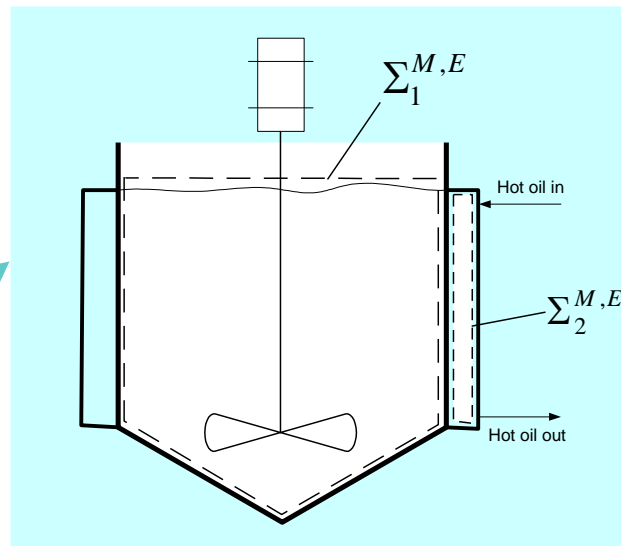
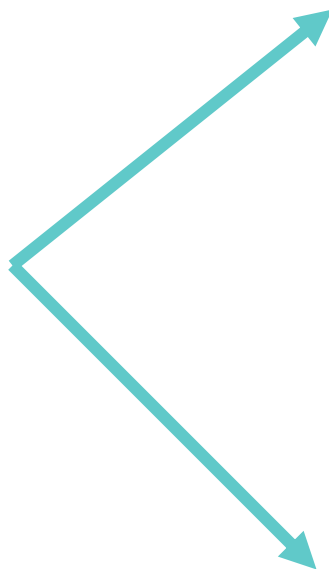
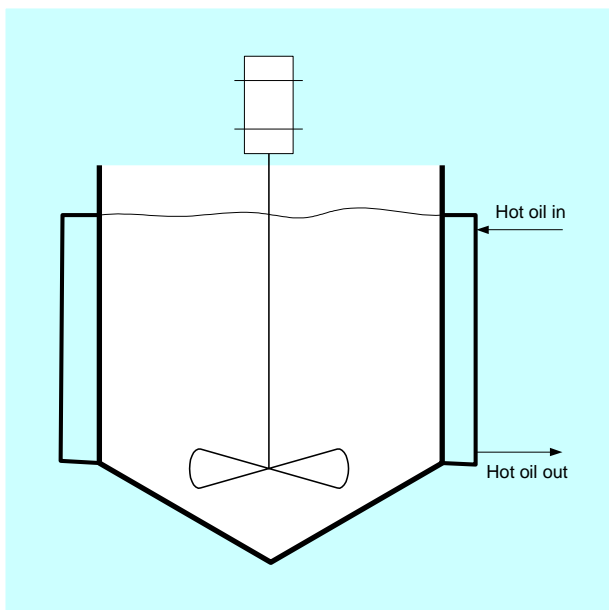


Spherical

# Relation Between Balance Volumes

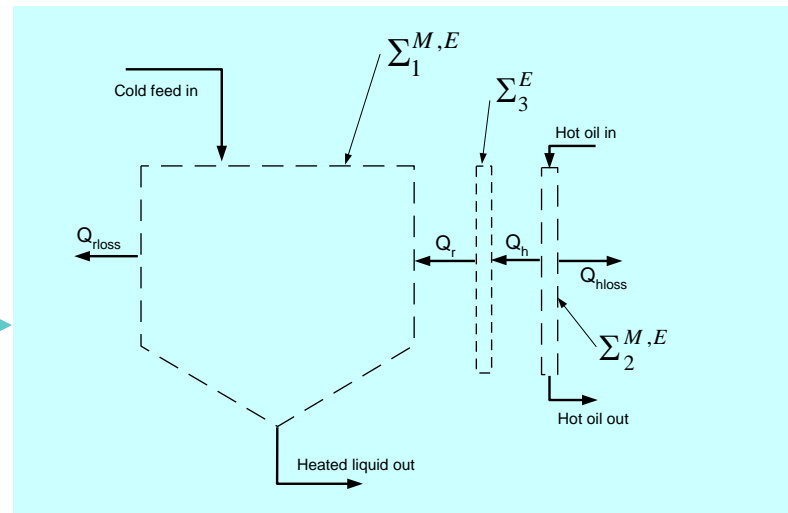
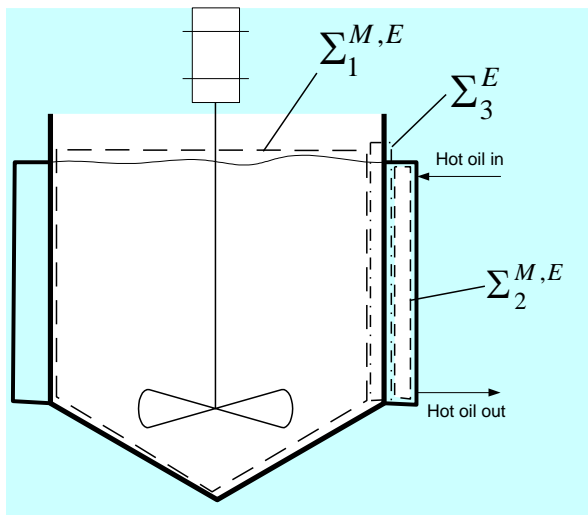
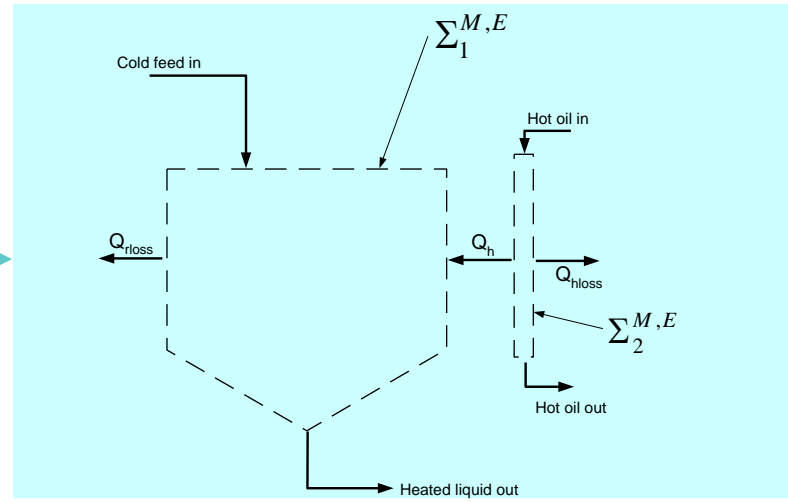
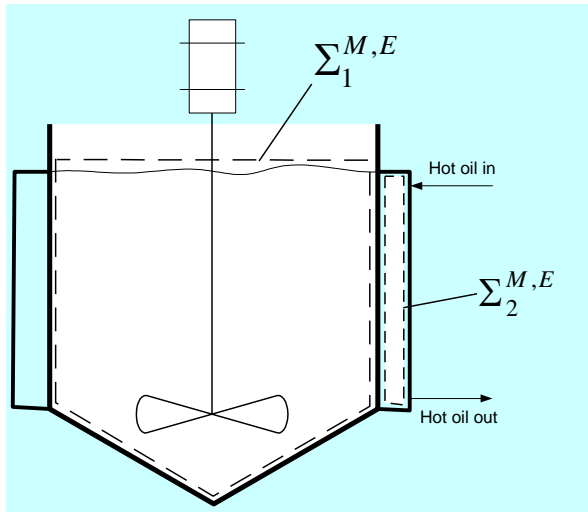
- ❖ Mass balance volume set: *primary set*
  
- ❖ Energy balance volume set can span or encapsulate mass balance sets
  
- ❖ Balance volume manipulations
  - coalescence
  - division

# Balance Volumes for a Heated CSTR

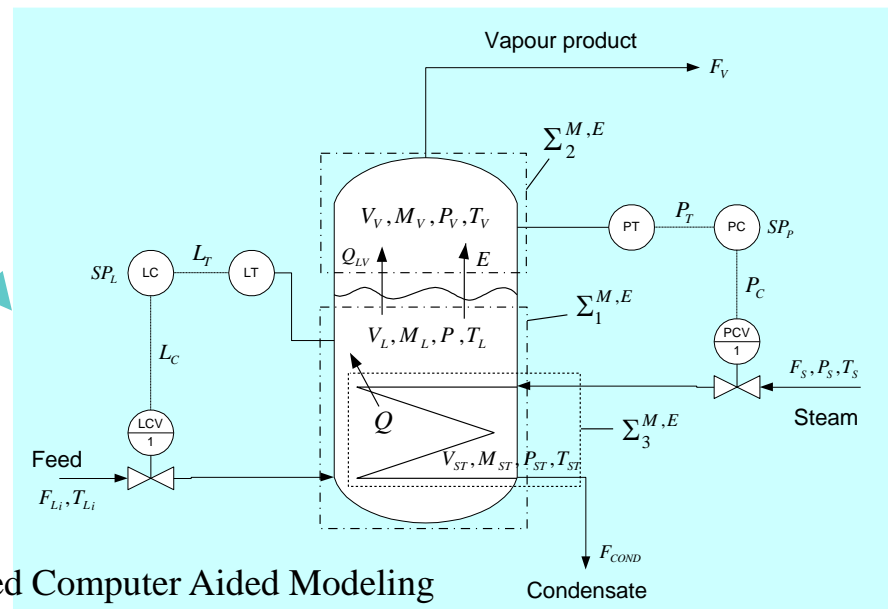
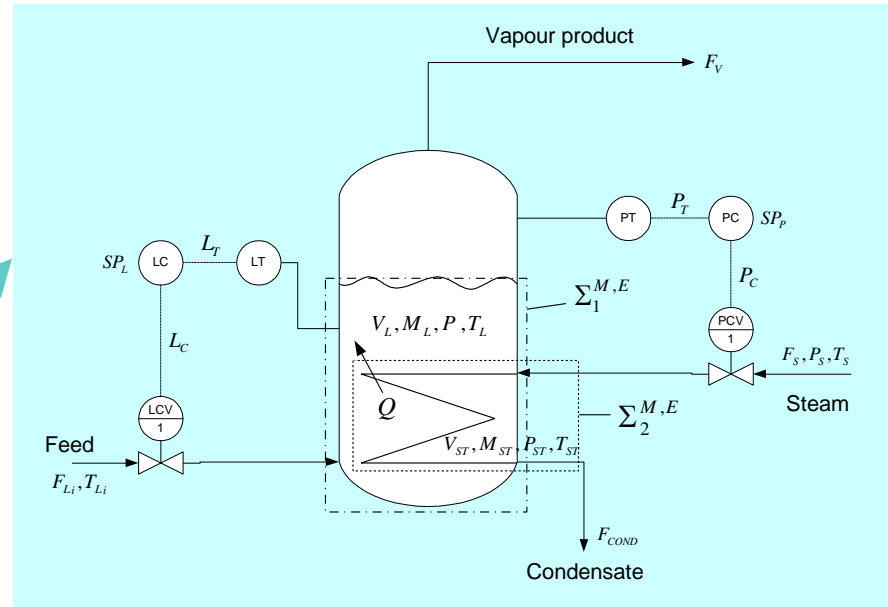
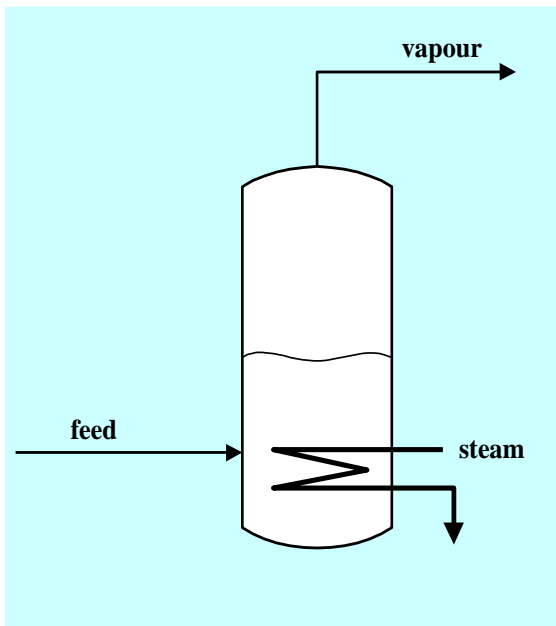




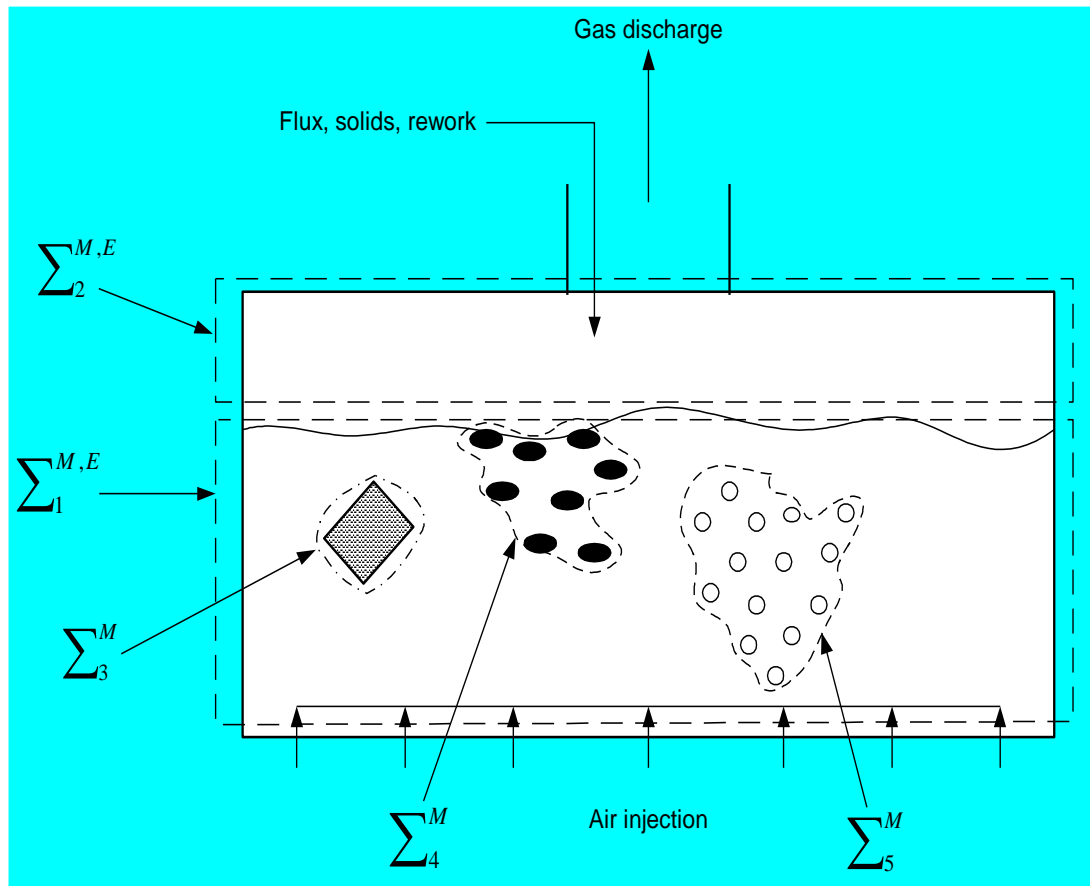
# Relationship Between Balance Volumes



# Balance Volumes for a Vaporizer



# Balance Volumes for Copper Converter



# Extensive and Intensive Properties

## ❖ Extensive Properties

- depend on the extent of the system (overall mass; component masses; energy; enthalpy; ...)

$$E_i^S = E_i^{S_1} + E_i^{S_2}$$

## ❖ Intensive Properties

- do not depend on extent

$$I_k = f(I_i, I_j)$$

## ❖ Extensive properties are conserved

$$E = M f(I_j, I_i)$$

# Intensive Properties

## Intensive

- P, T, compositions
- mass specific properties

$$I_k = \frac{E_k}{M}$$

- key variables for constitutive relations

## Potentials

- driving forces for diffusive flow of their extensive counterpart

# Lecture 2b: Constitutive Relations

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# What are constitutive relations?

- ❖ Relate conserved extensive quantities to intensive variables
- ❖ Help define physico-chemical quantities (e.g. enthalpies, densities, viscosities ,...)
- ❖ Define transfer rates (mass, energy, ...)
- ❖ Other relations to “constitute” the model

# How do constitutive relations arise ?

❖ Related to the terms in the conservation equations for mass, energy and momentum

- Convective flow terms (process streams)

- Molecular flow streams (fluxes)

- Internal processes

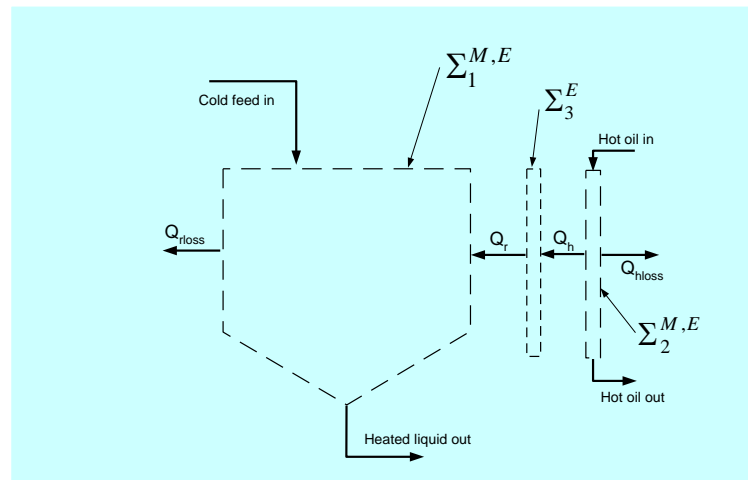
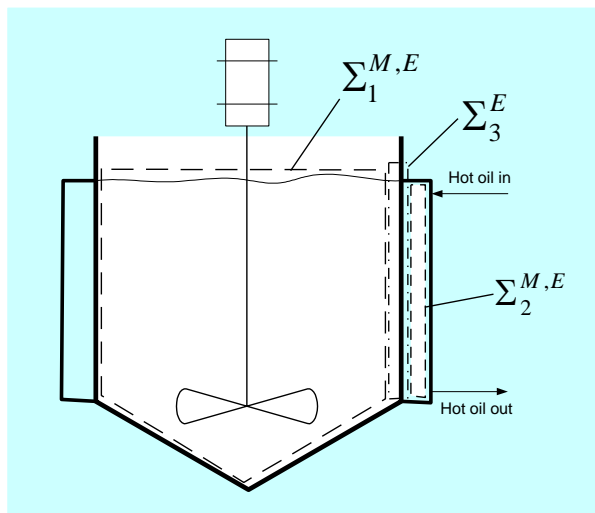
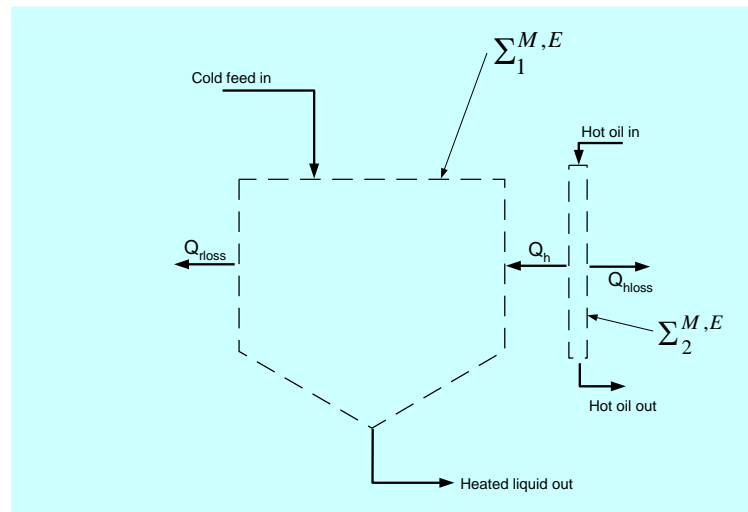
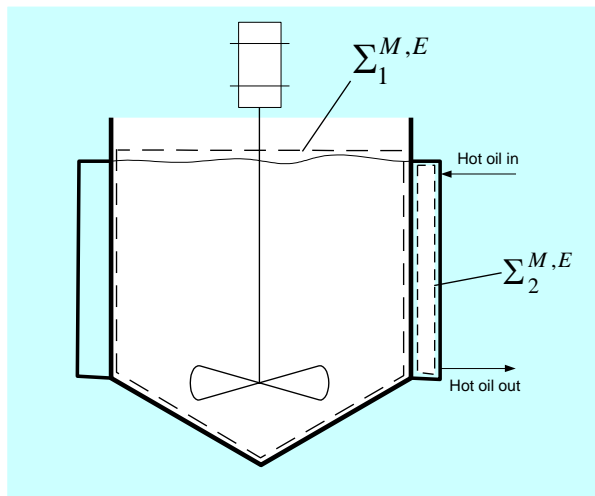
$$\frac{\partial \Phi}{\partial t} = -\nabla \bullet J + q$$

- Defining intensive variables in terms of extensive quantities and other physico-chemical properties

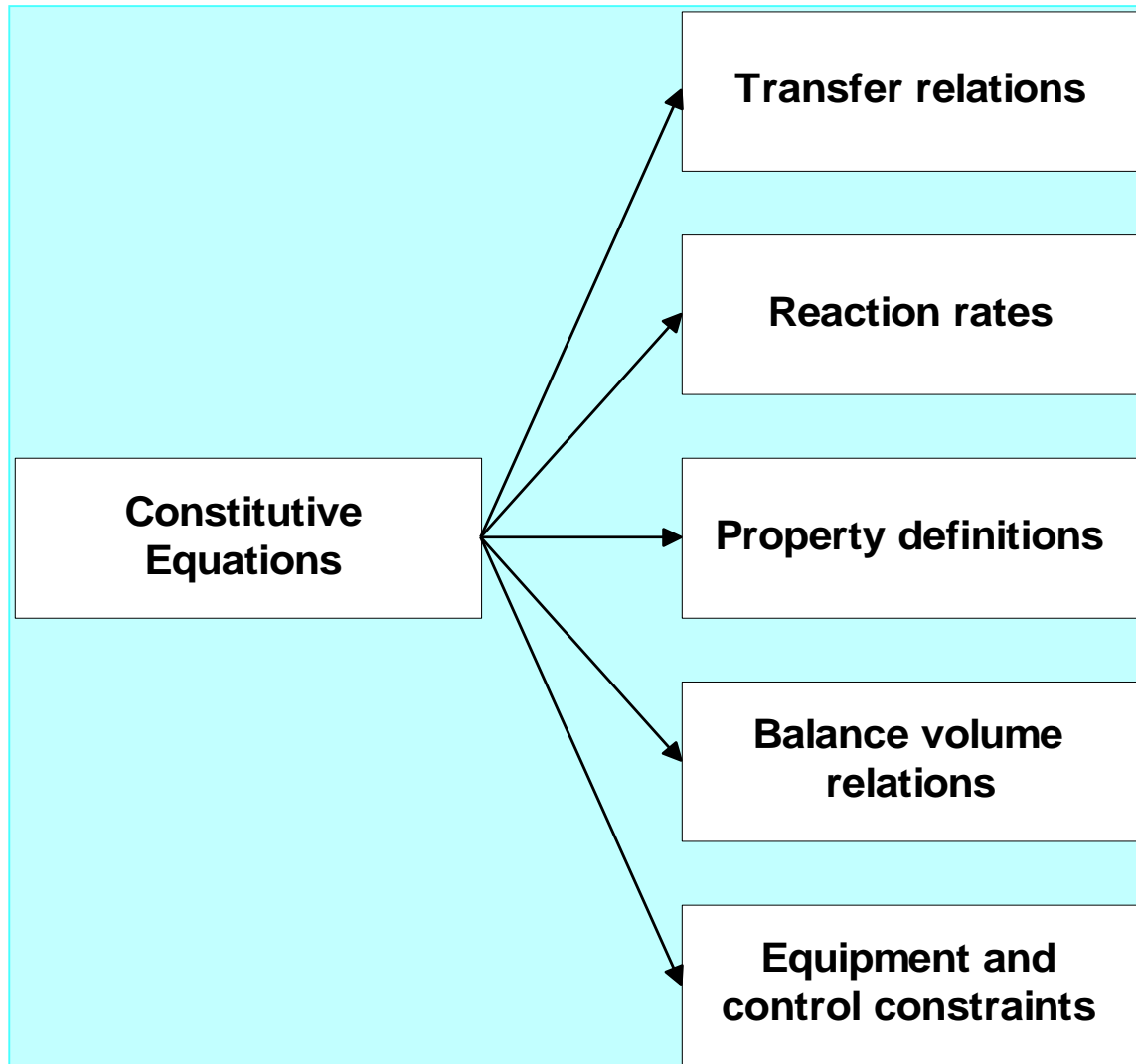
- **Constraints on the system (control relations)?**



# Balance volumes, flows and system processes



# Classes of Relations



These are conditional equations and not constitutive equations

# 1. Transfer Relations

## ❖ General form

$$rate_{\chi}^{(p,r)} = \psi^{(p,r)} \left( \zeta^{(p)} - \kappa^{(r)} \right)$$

## ❖ Particular forms

- mass transfer

$$j = K_G (C_G^* - C_G)$$

- heat transfer

$$q_{cv} = UA\Delta T$$

## 2. Reaction rates

- ❖ Reaction rate  
(batch reactor only)

$$r_i = \frac{1}{V} \frac{dn_i}{dt}$$

- ❖ General reaction expression

$$r_A = k_A f(C_A^\alpha, C_B^\beta, \dots)$$
$$k_A = k_0 e^{-\frac{E}{RT}}$$

# 3. Thermodynamic relations

- ❖ Property relations (density, viscosity, ...)

$$\rho_L = f(P, T, x_i)$$

- ❖ Equilibrium relations (control/conditional equation)
  - Raoult's law
  - Isofugacity criteria (same model for each phase)
  - Gamma-Phi (different models for each phase)

# Models for Thermodynamic properties

## ❖ Enthalpy

$$h(T) = h(T_R) + \int_{T_R}^T c_p(T) dT$$

### ■ linear

$$h(T) = c_p T$$

$$h(T) = c_p T + \lambda_{VAP}$$

### ■ nonlinear

$$c_p = a_0 + a_1 T + a_2 T^2 + \dots$$

$$h(T) = h(T_0) + \int_{T_0}^T c_p(T) dT$$

# Models for Thermodynamic properties

## ❖ Equations of state

- ideal gas

$$PV = nRT$$

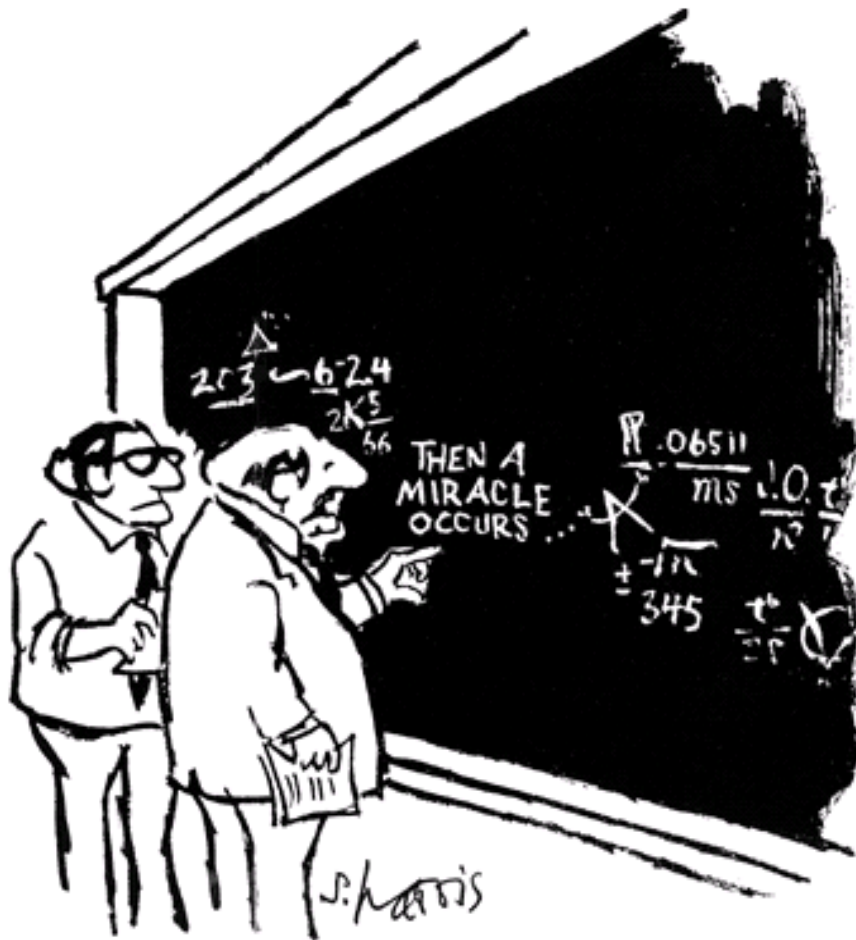
- cubic EoS

$$P = f(V, T)$$

- SRK
- Peng Robinson

## ❖ Ge Models (NRTL, UNIQUAC, UNIFAC, ...)

# How do constitutive relations arise ?



"I think you should be more explicit here in step two."

**Constitutive model developers perform miracles everyday!**

- Add one or more parameters (regress them with available experimental data)
- Use another model to generate the missing data

.....

***Develop a better theory!***



## 4. Balance volume relations

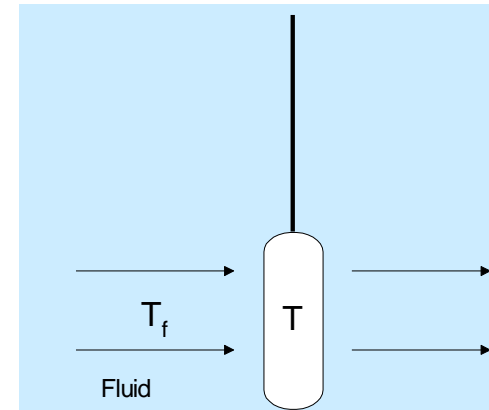
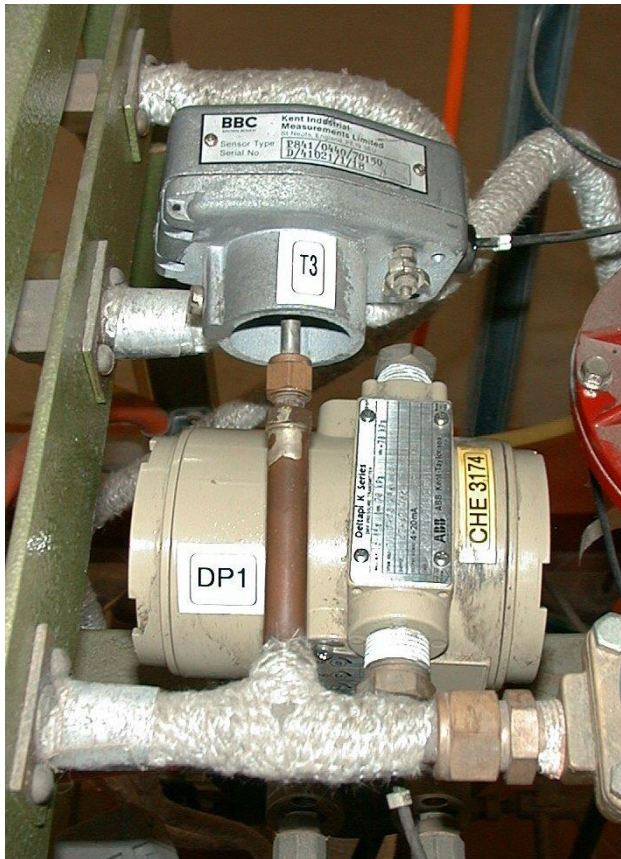
❖ Relations between phases  
(control/conditional equations)



$$V_G = V - V_L$$

# 5. Equipment and Control

## ❖ Sensors



$$\frac{dU}{dt} = \frac{d(Mc_p T)}{dt} = \tilde{U}A(T_f - T)$$

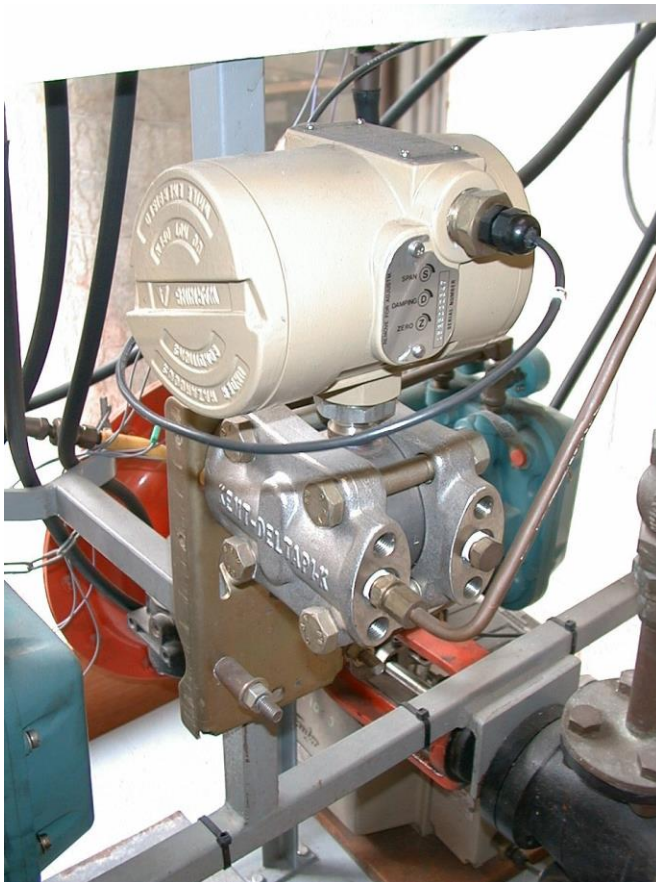
$$\frac{dT}{dt} = \frac{\tilde{U}A}{Mc_p} (T_f - T)$$

$$\frac{dT}{dt} = \frac{(T_f - T)}{\tau}$$

**What is the unit of  $\tilde{U}$ ?**

## 5. Equipment & Control: Control Elements

Transmitters (4-20mA, 20-100kPa) – calculate the measured (controlled) variable signal



$$O_p = O_{p_{\min}} + (I_p - z_0)G$$

$I_p$  is the input signal

$z_0$  is the zero

G is the gain

## 5. Equipment & Control: Controllers

### Traditional (P, PI, PID)

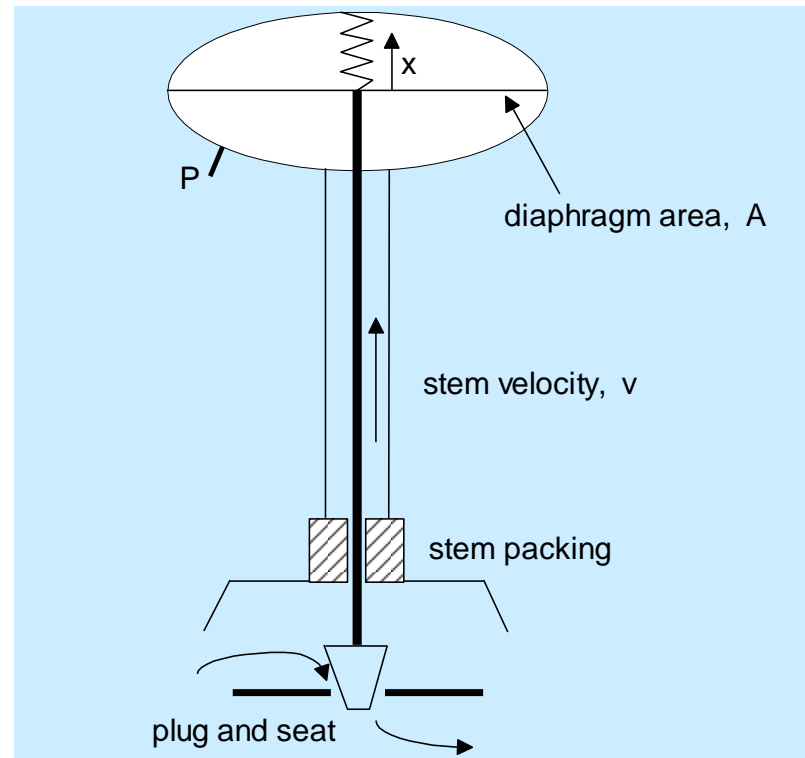
$$O_c = B + K_c (S_p - O_p) = B + K_c \varepsilon$$

$$O_c = B + K_c \varepsilon + \frac{K_c}{\tau_I} \int \varepsilon dt$$

$$O_c = B + K_c \varepsilon + \frac{K_c}{\tau_I} \int \varepsilon dt + K_c \tau_D \frac{d\varepsilon}{dt}$$

$$\mathbf{O_c = u; B = u^*; S_p = y^*; O_p = y}$$

# Actuators on valves



$$\tau^2 \frac{d^2 S}{dt^2} + 2\xi\tau \frac{dS}{dt} + S = G_a I$$

$S$  = stem movement(0-1)

$G_a$  = actuator gain

$\tau, \xi$  = time constant and damping factor

**Note:**  
 $I = O_c$

## 5. Equipment & Control: Valves

❖ Static valves

$$F = C_v \sqrt{\Delta P}$$

❖ Control valves

- characteristics

$$F = C_v c(S) \sqrt{\Delta P}$$

$$c(S) = S$$

linear

$$c(S) = a^{S-1}$$

equal percentage

$$c(S) = \sqrt{S}$$

square root

# Modelling exercise – 2b: Constitutive models

## Problem-I (home exercise)

1. Write\* the reaction rate models for compounds **A** and **B** for the following reaction system:



$$\mathbf{k}_{1f} = 0.01; \mathbf{k}_{1b} = 5.0; \mathbf{k}_{2f} = 10.0, \mathbf{k}_{3f} = 100$$

2. Write\* a model for pure component vapour pressure as a function of temperature
3. Write\* the model for estimating component liquid activity coefficients as a function of liquid composition and temperature

**\* Provide derivation details & model description**

**Select any property model for I-2 and I-3**