

# **Model based methods and tools for process systems engineering**

**Rafiqul Gani**

**PSE for SPEED\*,  
Department of Chemical & Biochemical Engineering,  
Technical University of Denmark,  
DK-2800 Lyngby, Denmark  
rag@kt.dtu.dk**

**\*Sustainable Product-Process Engineering, Evaluation & Design**

Takamatsu, Sargent, .... PSE-series (1982), PSE-China(1979)

**Sargent (1988):** Process systems engineering is all about the development of systematic techniques for process modelling, design and control.....

Some formulate their problem, or some useful simplification of it, in precise mathematical terms, then seek to exploit the mathematical structure to obtain an effective algorithm, while others seek insight on the problem structure from physical intuition.

Takamatsu, Sargent, .... PSE-series (1982), PSE-China(1979)

**PSE:** Use of a systematic approach to problem solving! Also, Use of computer aided and systematic approach to solving process engineering problems!

**Scope & Significance** of PSE/CAPE is potentially very large and depends on the application range of the developed solution approaches.

**Numerical analysis**

**=>**

**Modelling &  
Simulation**

**Mathematical Programming**

**=>**

**Optimization**

**Systems and Control Theory**

**=>**

**Process Control**

**Computer Science**

**=>**

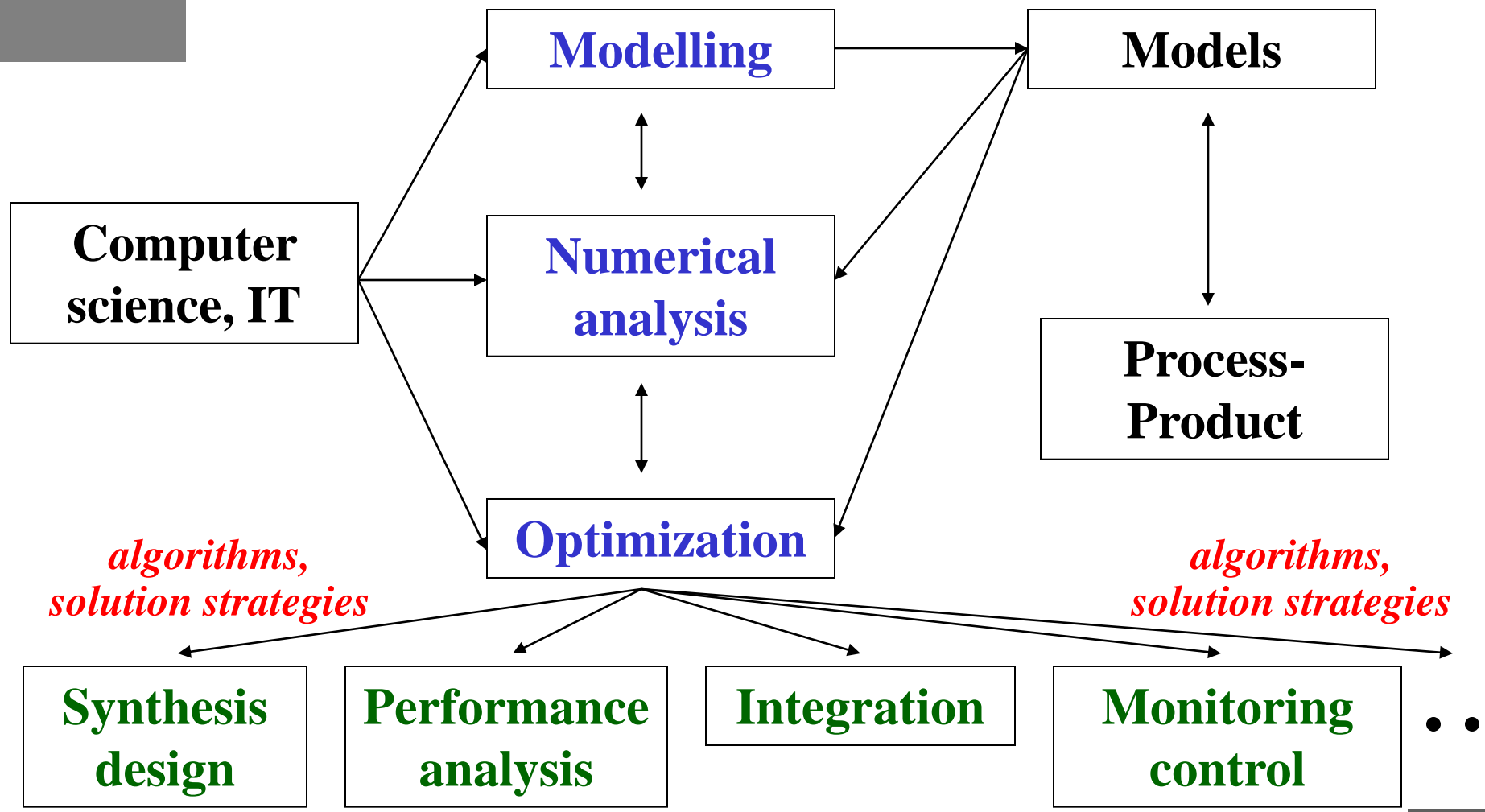
**Advanced  
Info./Computing**

**Management Science**

**=>**

**Operations/Business**

***Math Programming & Control Theory “competitive” advantage***



**Numerical analysis => Simulation => Behavior of process-product**

**Mathematical Programming => Optimization => Synthesis/design**

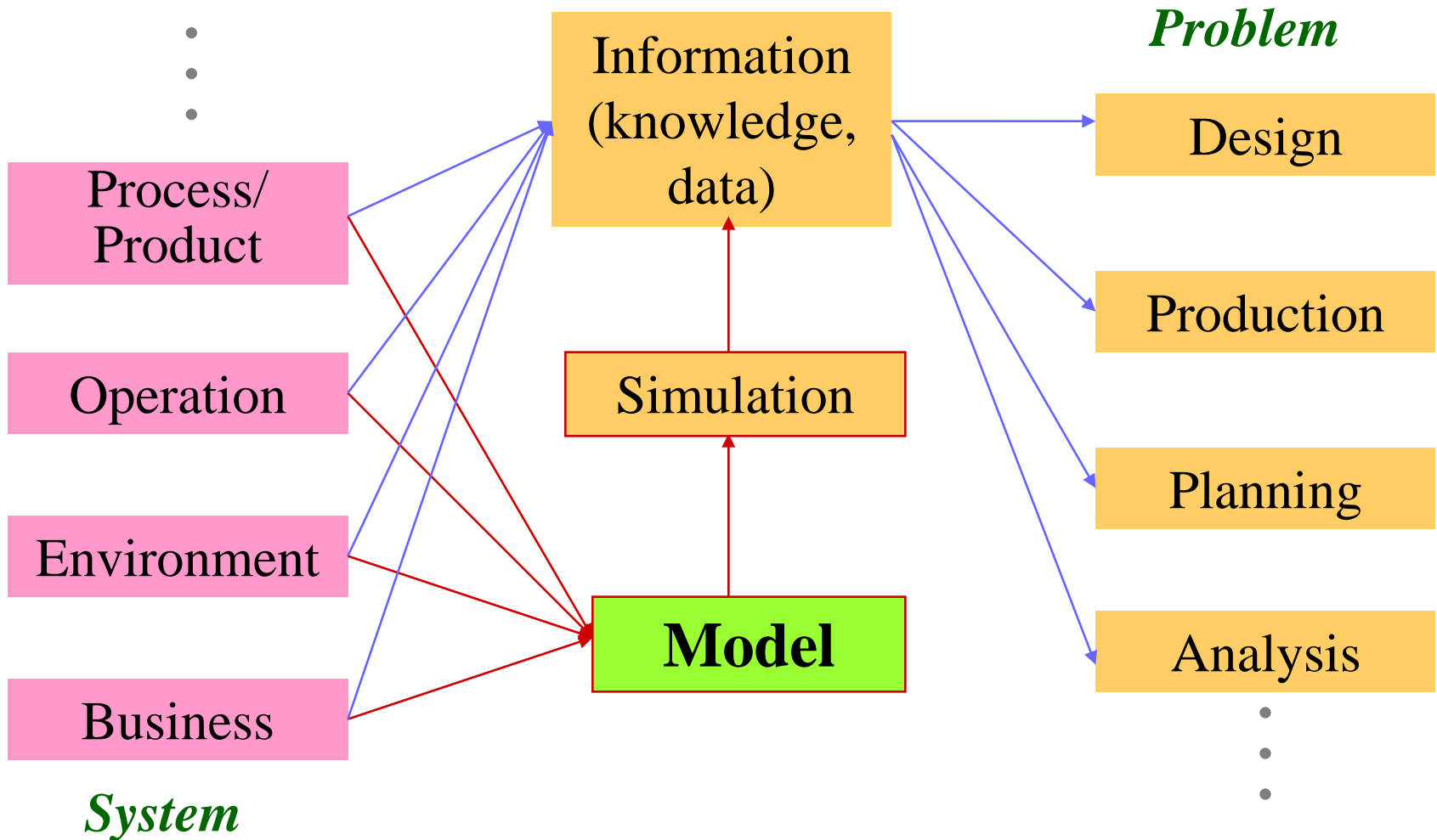
**Systems and Control Theory => Process Control => Manufacture**

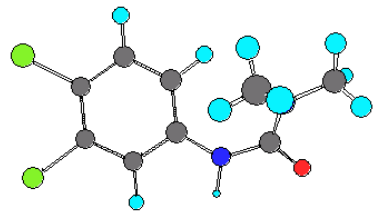
**Computer Science => Advanced Info./Computing => Efficient**

**Management Science => Operations/Business => <sup>problem solving</sup> Supply chain**

*What is necessary is models of various types, forms and application range*

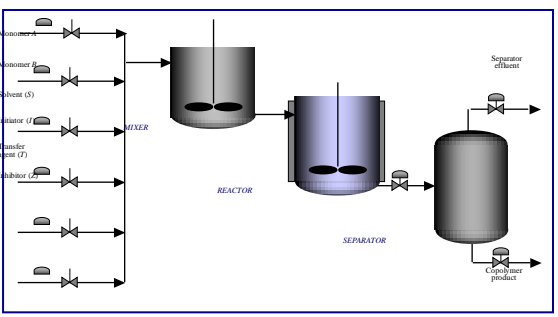
# Models have an important role in PSE





## Property models

$$\text{Log } P_i = A_i + [B_i / (C_i + T)]$$



## Process models

$$\frac{dm_i}{dt} = f_{in,i} - f_{out,i} - r(m, T, P)V; i = 1, NC$$

Models for environmental impact

**Operation models**

**Process models**

**Property-kinetics models**

**Cost models**

Models for sustainability metrics

**Formulation process model**

**Product evaluation model**



# SPEED Example: Problem formulation & solution

$$F_{obj} = \min \{ \mathbf{C}^T \mathbf{y} + f(\mathbf{x}, \mathbf{y}, \mathbf{u}, \mathbf{d}, \boldsymbol{\theta}) + S_e + S_i + S_s + H_c + H_p \}$$

## Process-product model

$$P = P(\mathbf{f}, \mathbf{x}, \mathbf{y}, \mathbf{d}, \mathbf{u}, \boldsymbol{\theta})$$

## Process-product

$$0 = h_1(\mathbf{x}, \mathbf{y})$$

## Equipment-material

$$0 \geq g_1(\mathbf{x}, \mathbf{u}, \mathbf{d})$$

$$0 \geq g_2(\mathbf{x}, \mathbf{y})$$

## Flowsheet-chemical alternatives

$$\mathbf{B} \mathbf{x} + \mathbf{C}^T \mathbf{y} \geq \mathbf{D}$$

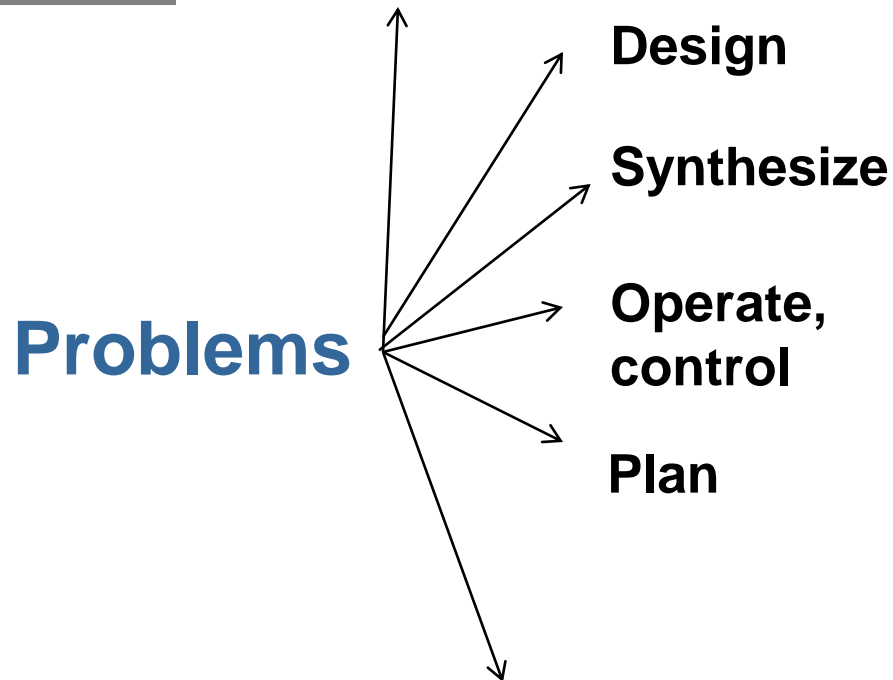
## Problems:

LP, NLP, MILP, MINLP,  
process simulation, .....

## Solution strategies:

Direct,  
Decomposition based

$\mathbf{x}$ : real-process variables;  $\mathbf{y}$   
integer-decision variables



### Problem defined by

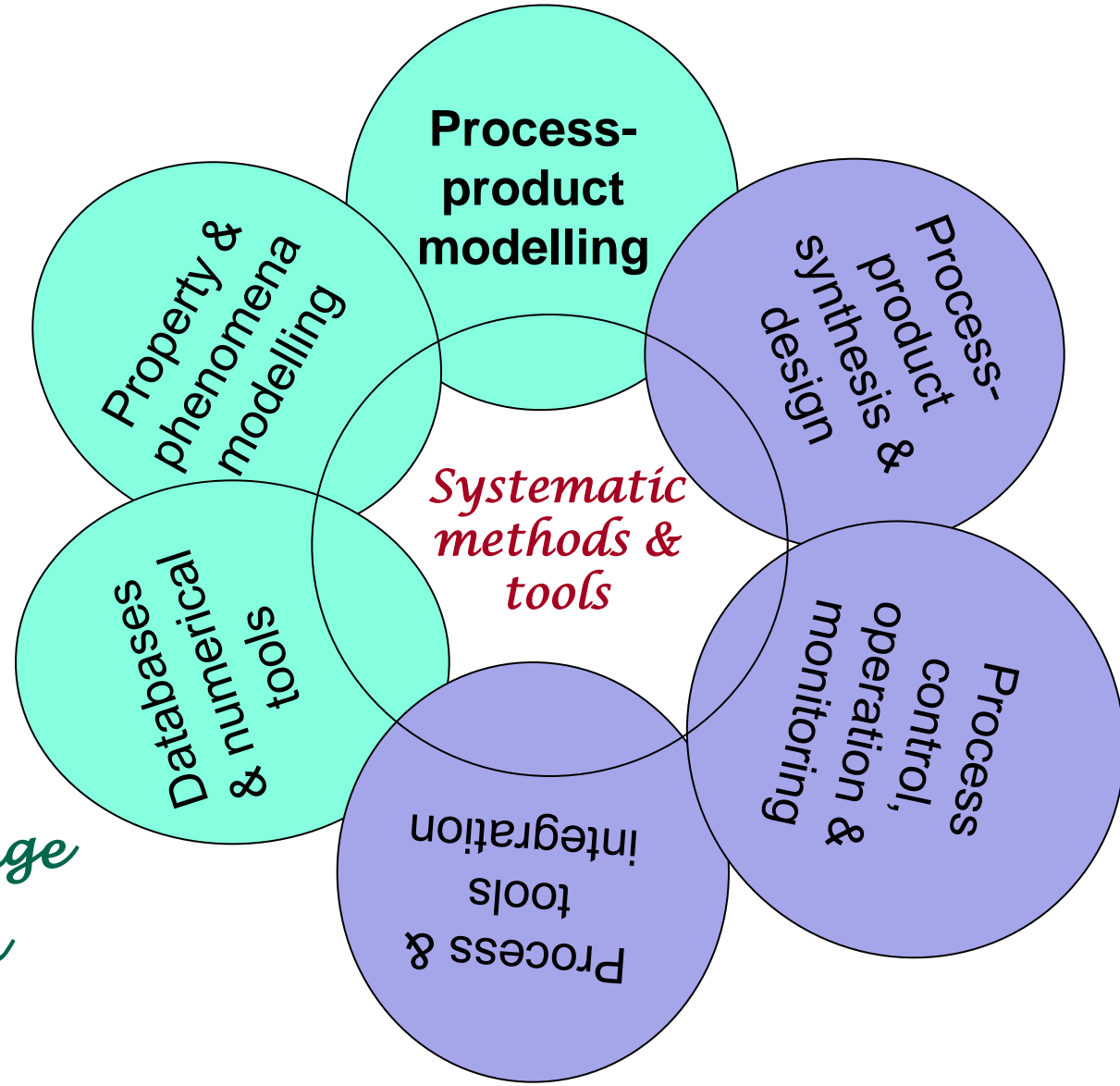
- **System boundary**
- **Models (of different types, sources, ....)**
- **Data (from different sources, )**
- **Multi-objectives & multi-disciplines**
- .....

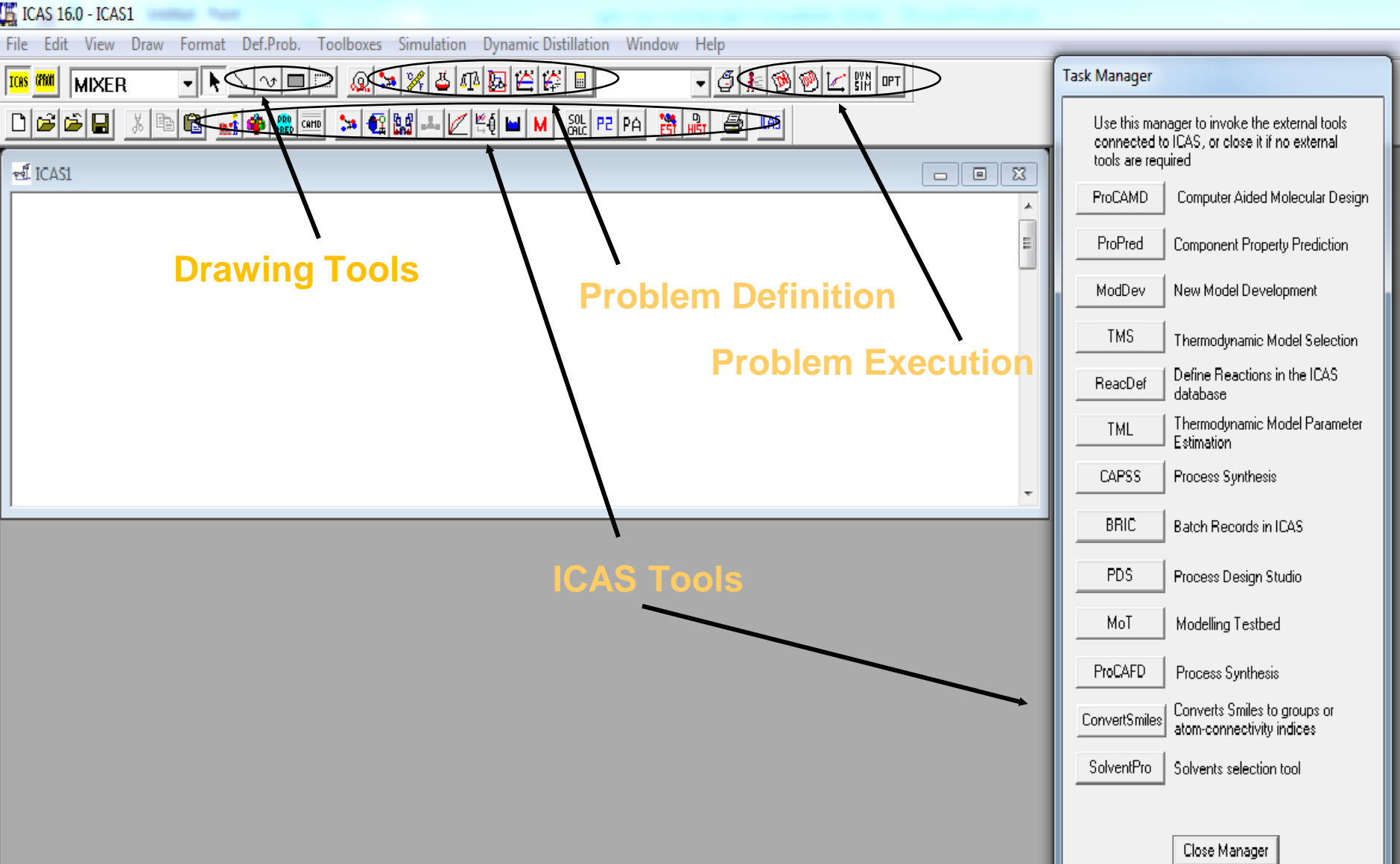
**PSE** = *systematic solution of problems by efficient management of the complexity*

- **Process simulators (mainly commercial)**
- **Solvers (GAMS, Matlab, ...)**
- **Specialized software**
  - **Control**
  - **Planning & scheduling**
  - **Fault diagnosis**
  - .....

- **Define the problem**
- **Analyze the problem**
- **Determine an appropriate solution strategy**
- **Solve & verify**

- *Defines application range*
- *Defines solution approach*





The screenshot shows the ICAS 16.0 - ICAS1 software interface. The top menu bar includes File, Edit, View, Draw, Format, Def.Prob., Toolboxes, Simulation, Dynamic Distillation, Window, and Help. Below the menu is a toolbar with various icons. Three groups of icons are circled in black: drawing tools (left), problem definition tools (middle), and problem execution tools (right). Arrows point from these circles to labels: 'Drawing Tools' (yellow text), 'Problem Definition' (yellow text), and 'Problem Execution' (yellow text). A large arrow points from the 'ICAS Tools' label (yellow text) to the 'Task Manager' panel on the right. The Task Manager panel lists various external tools and their functions.

**Task Manager**

Use this manager to invoke the external tools connected to ICAS, or close it if no external tools are required

ProCAMD	Computer Aided Molecular Design
ProPred	Component Property Prediction
ModDev	New Model Development
TMS	Thermodynamic Model Selection
ReacDef	Define Reactions in the ICAS database
TML	Thermodynamic Model Parameter Estimation
CAPSS	Process Synthesis
BRIC	Batch Records in ICAS
PDS	Process Design Studio
MoT	Modelling Testbed
ProCAFD	Process Synthesis
ConvertSmiles	Converts Smiles to groups or atom-connectivity indices
SolventPro	Solvents selection tool

Close Manager

## ICAS-Tools

### Database Manager



### ProCAMD



### ProPred



### MoT

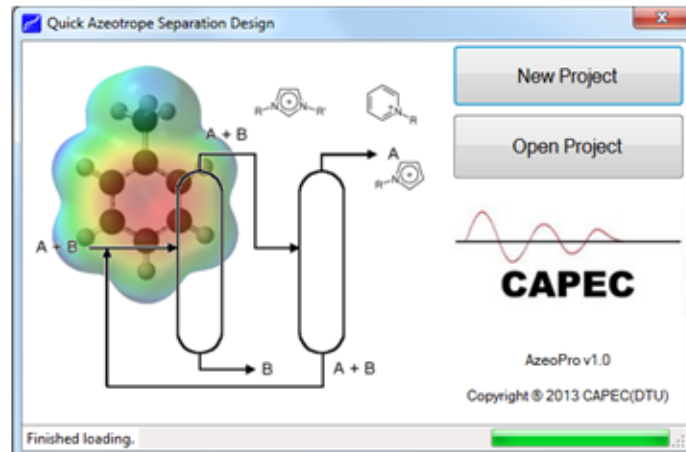


### SolventPro



## New Software

### AzeoPro



## EXCEL-based Macro

### SustainPro

Sustainable process design

### LCSoft

Life cycle analysis

### ECON

Economic analysis

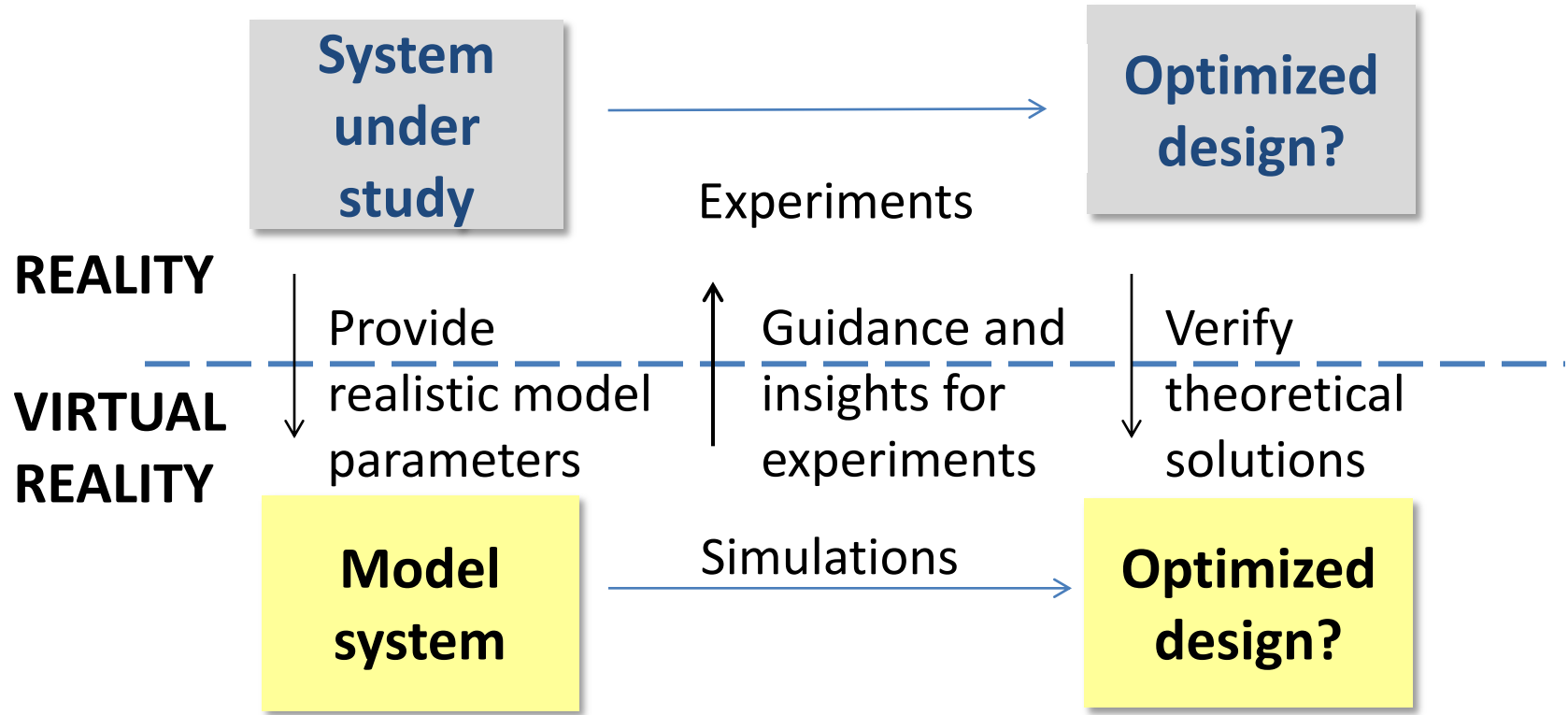
### ICAS-PAT

PAT system design

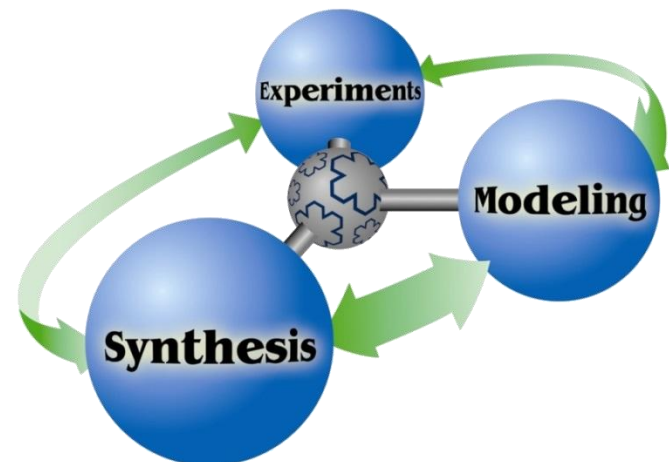
### Run-PC-SAFT

Use of PC-SAFT equation of state for pure component properties

# The Role of Models & Experiments



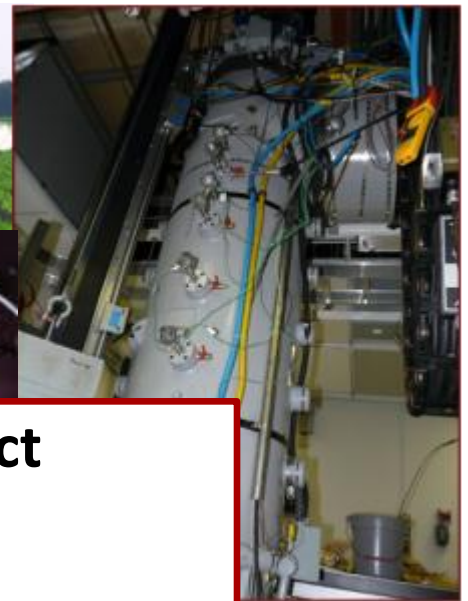
- Approaches
  - Integrated modeling, experiments and synthesis
  - Ability to find predictive-innovative solutions



# Computer Aided Modelling

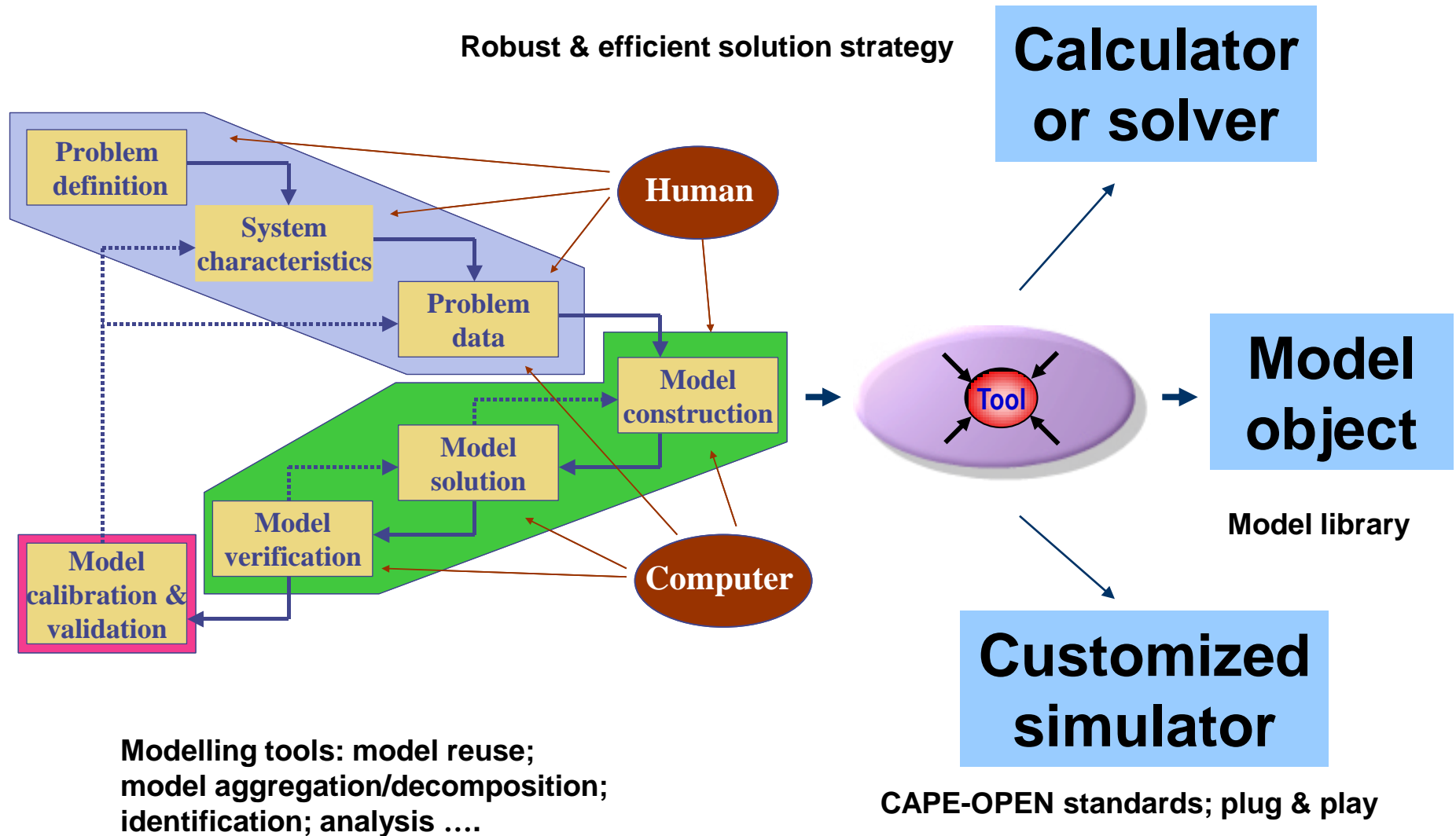
**Goal: Development of a computer-aided modelling framework**

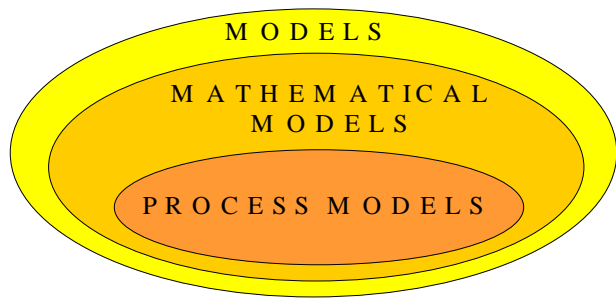
**Computer-aided modelling of increasing importance to face current and future challenges product-process engineering.**



- > Prediction and optimization of product process behaviour**
- > Reduce number of resource-demanding experiments**
- > Deliver truly innovative solutions**
- > Improved understanding of domain system**







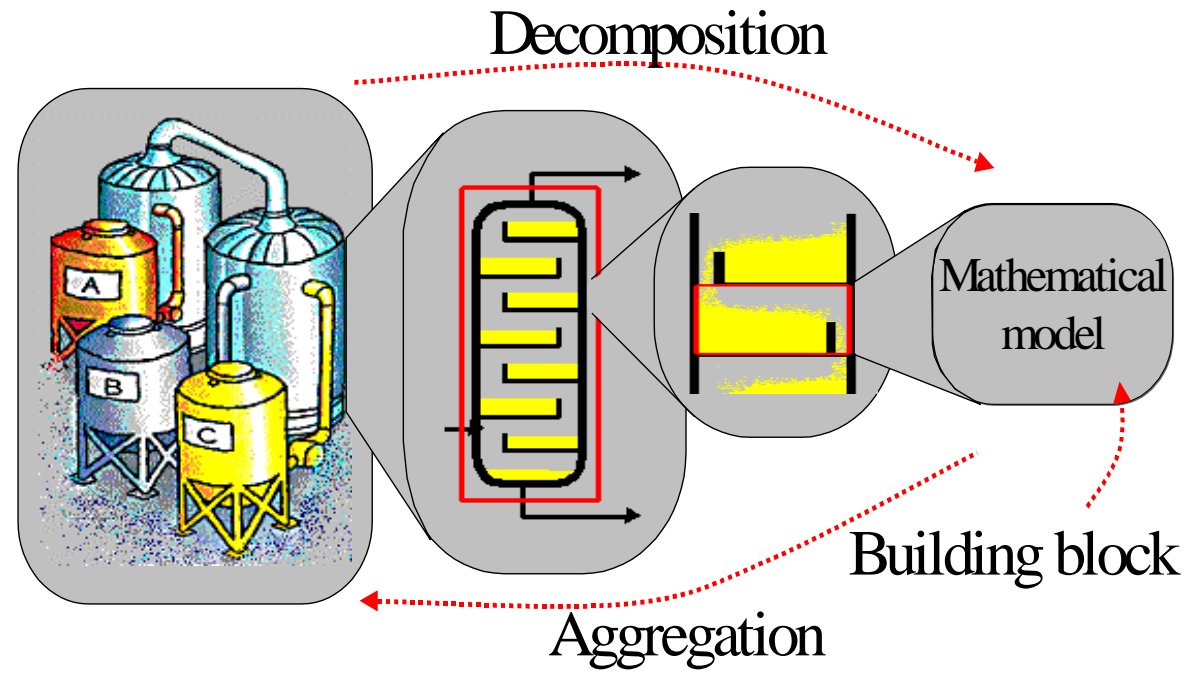
## Model domain

- **Derive the model equations (model generation)**
- **Translate & Analyze model equations (model translation)**
- **Solve model equations & generate model “object”(also, create library for use with a simulator or for on-line solution)**

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

## *Three Classes of Equations*

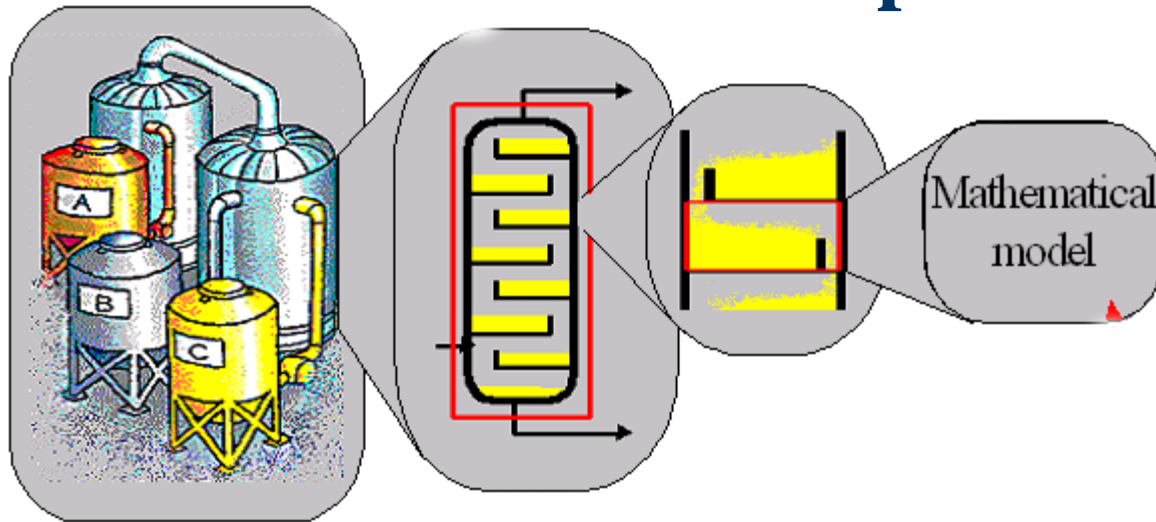
- \* **Balance Equations**
- \* **Constraint Equations**
- \* **Constitutive Equations**



**Define Boundary** → **Describe System** → **Identify Building Block**

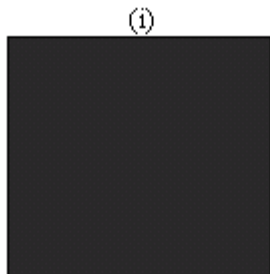
***Allows model construction, generation & reuse***

## Examples of Process Models

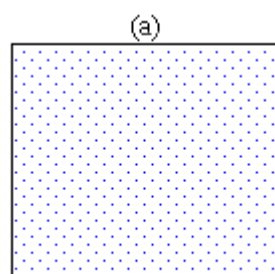


**Accuracy (verification)** ←

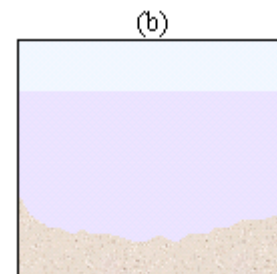
→ **Predictive power (design)**



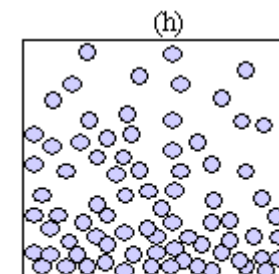
Black box



Perfectly mixed system



Equilibrium phase system



Particulated system with uniform gradient in one direction

## Property Models

**Correlations**

$$P_i = A_i + [B_i / (C_i + T)]$$

**Molecular**

$$Z_c = (P_c * V_c) / (83.14 * T_c)$$

CH<sub>3</sub>-; -CH<sub>2</sub>-; -OH; .....

**Groups**

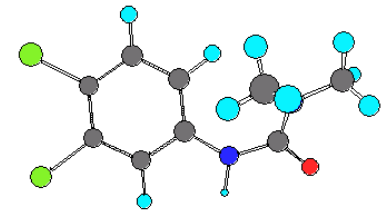
$$T_b = 222.543 * \log(\text{Sum.Groups.I} + \text{Sum.Groups.II} + \text{Sum.Groups.III})$$

C, H, O, N, S, .....

**Atoms**

$$P = \sum n_i P_i + b(v\chi_0) + 2c(v\chi_1)$$

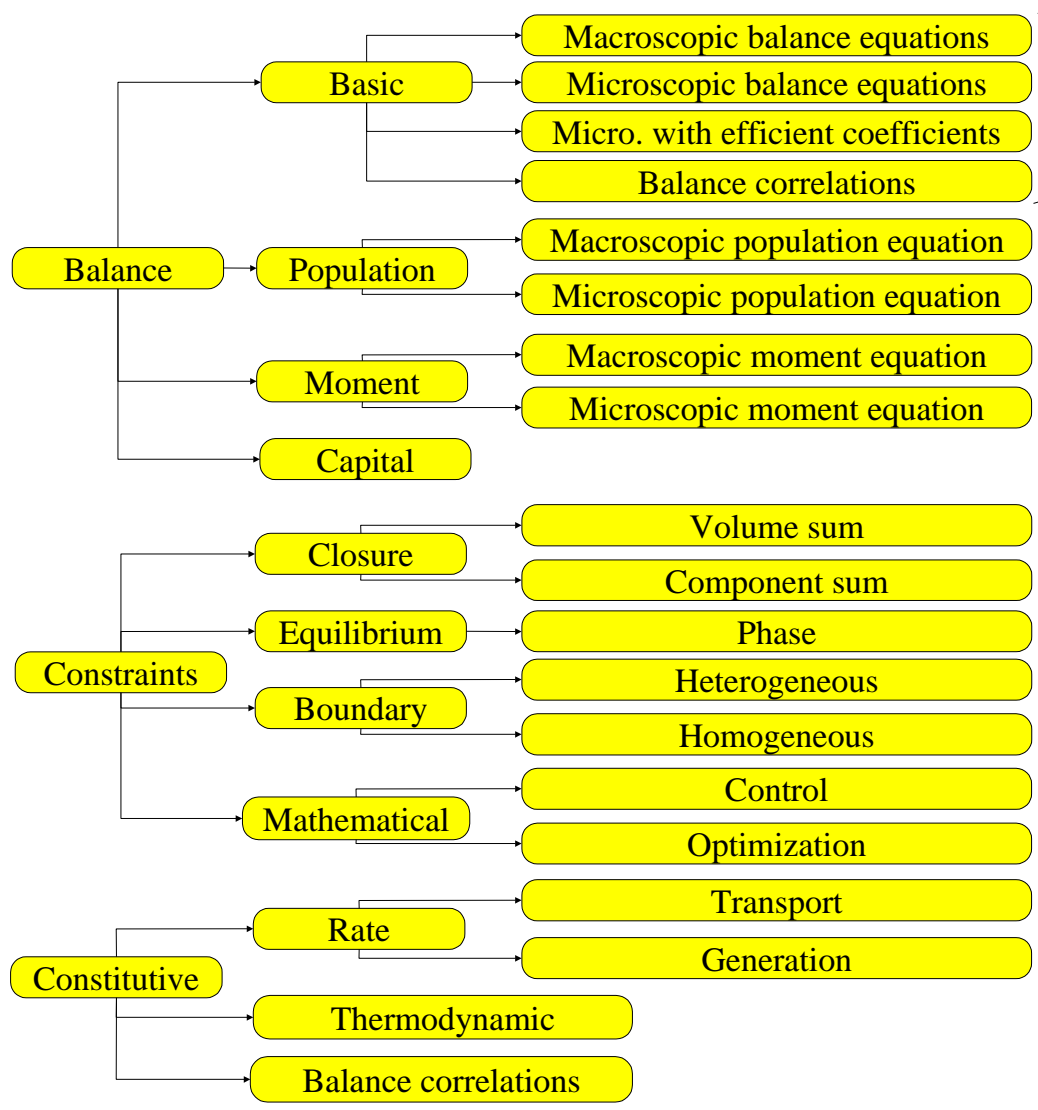
**Micro**



*Accuracy (verification)*

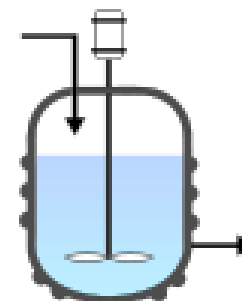
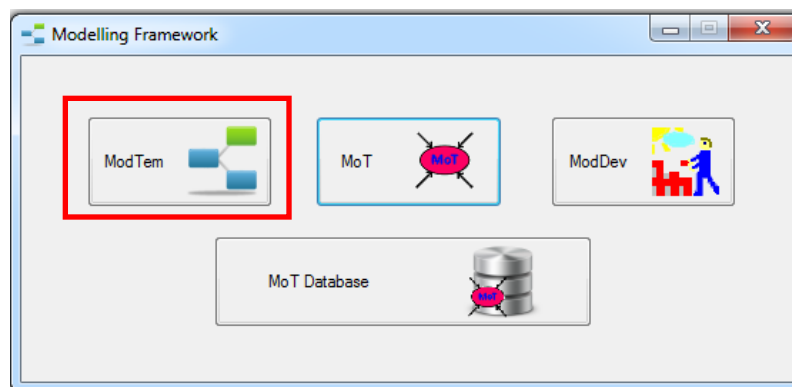
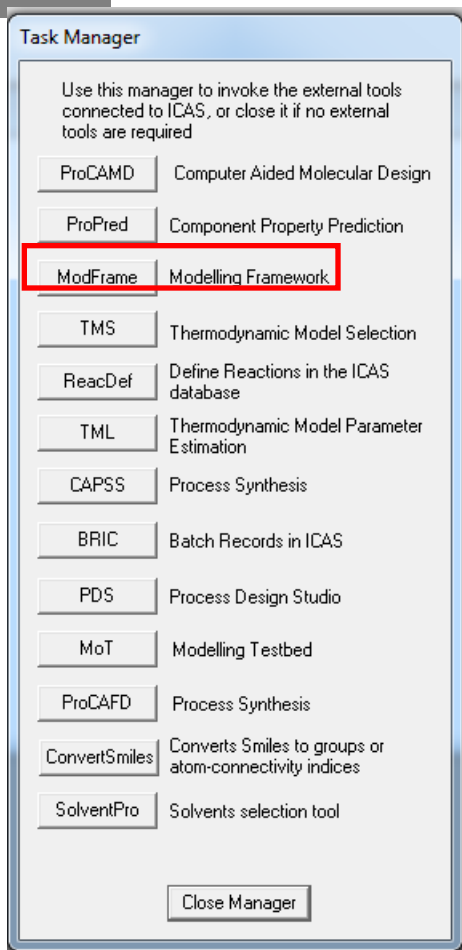
*Predictive power (design)*





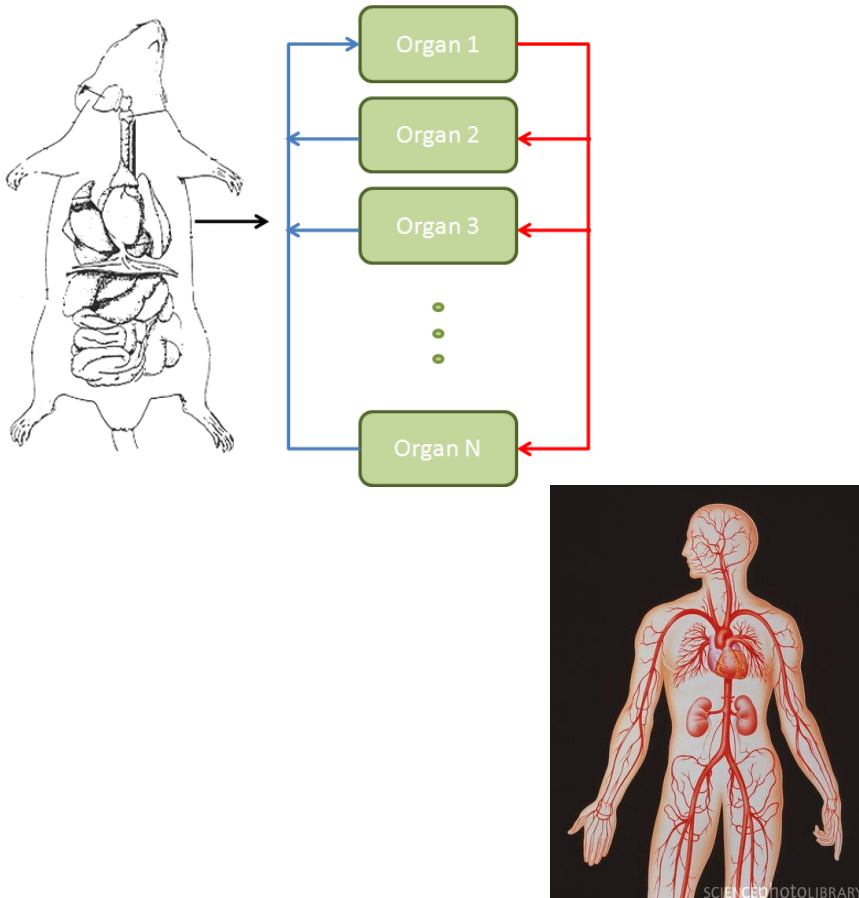
Can be transferred into balance equations for other extensive quantities by symbolic manipulation

**Describe modelling needs through a model derivation taxonomy – start from the left for each class of model equation and identify the end-point on the right. Retrieve the equations from a library for each end-point**



# Computer-Aided Modelling: Pharmacokinetics

## Pharmacokinetic modeling of drug distribution in rats



1. Retrieval and analysis of different candidate models  
**Phase I: Modelling objective and system information**  
**Phase II.B: Multi-scale model construction**
2. Discrimination between model candidates, estimation of identifiable model parameters  
**Phase III: Model identification/discrimination**  
**Phase IV: Model evaluation/validation**
3. Strategy for scale-up (to human)

-> Highlight modelling methodology (different work-flows) and software tool.

*A Mosat, E Lueshen, M. Heitzig, C. Hall, A A Linninger, G. Sin, R. Gani, 2013, "First principles pharmacokinetic modeling – A quantitative study on Cycloporin", Computers & Chemical Engineering, 54, 97-110; see also another paper in CACE 2014*



## The key chemical products

### Commodities

### Molecules

### Microstructures

Key

**Cost**

**Speed**

**Function**

Basis

**Unit Ops**

**Chemistry**

**Microstructure**

Risk

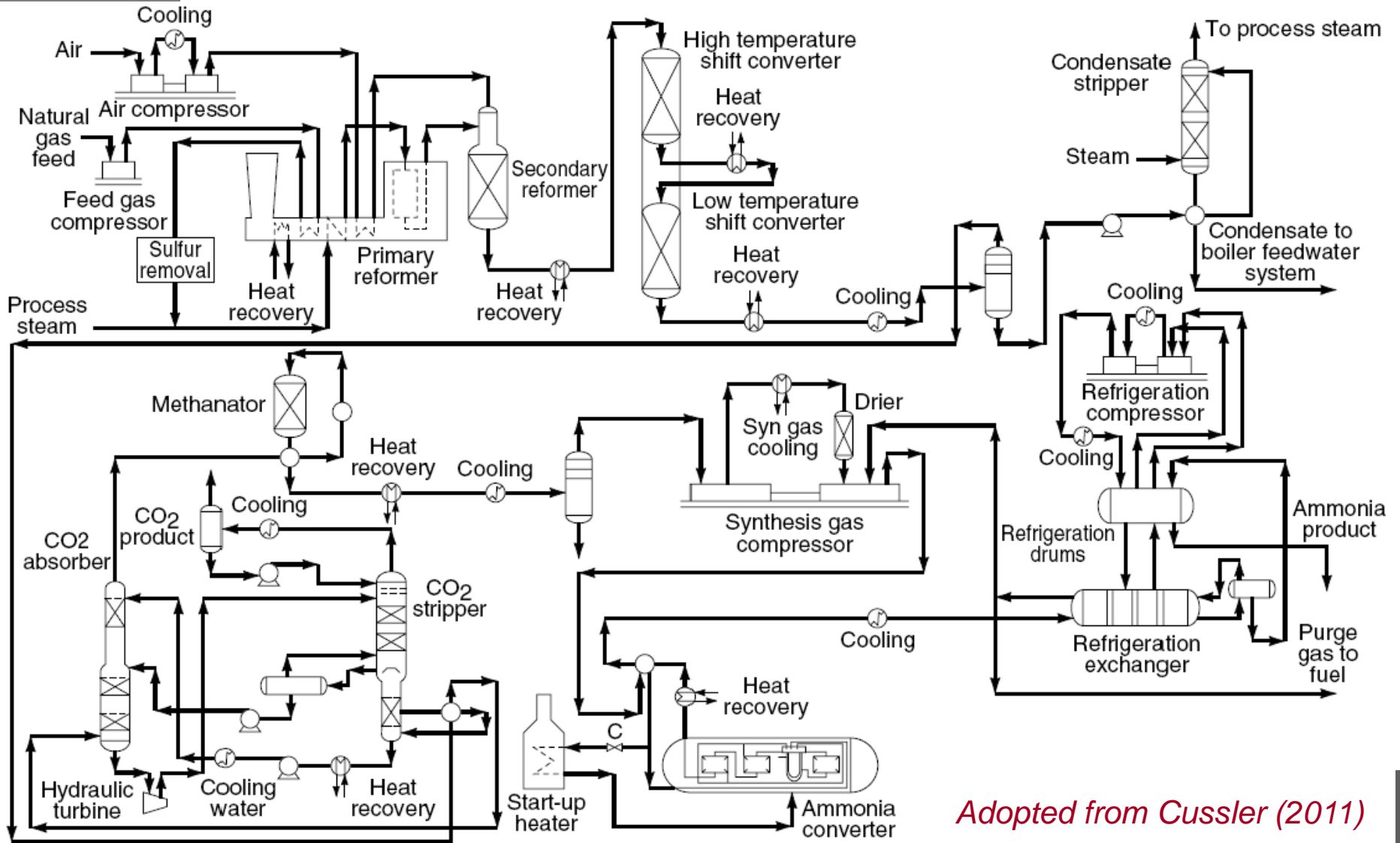
**Feedstock**

**Discovery**

**Science**

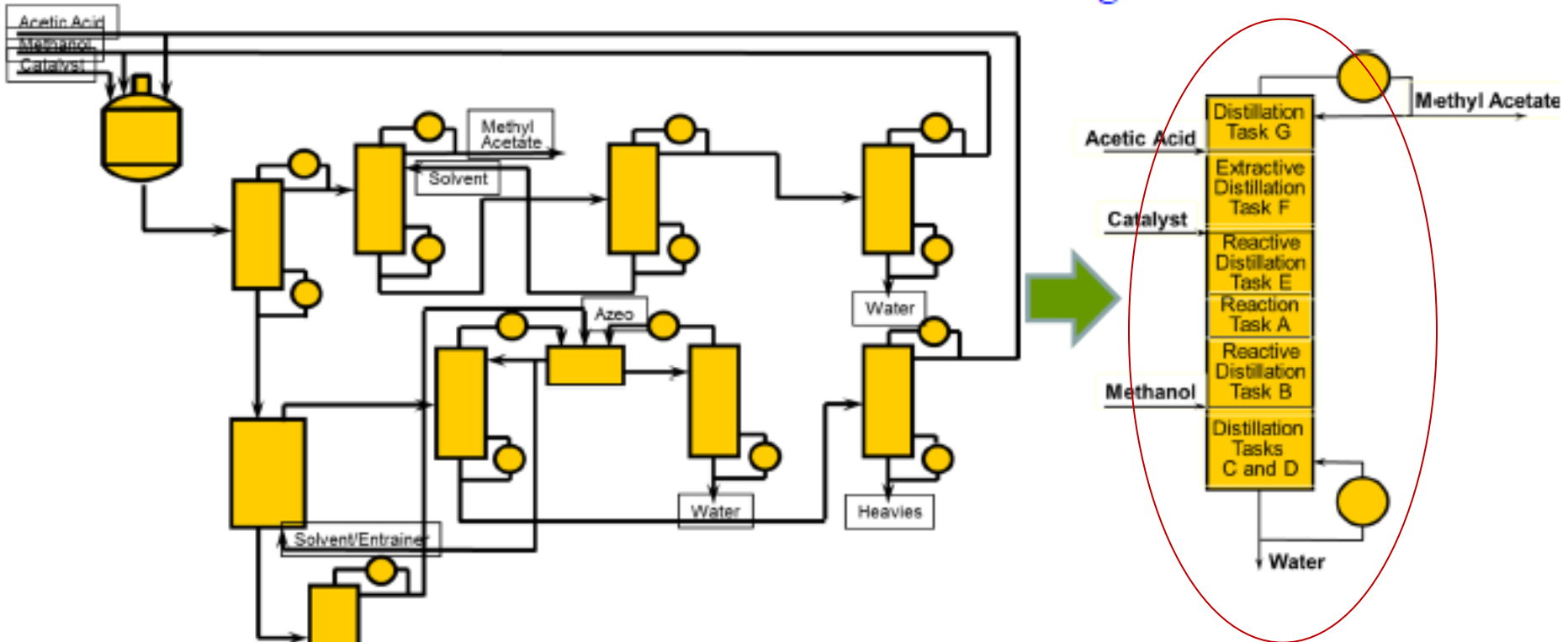
## Skills Required?

*Adopted from Cussler (2011)*



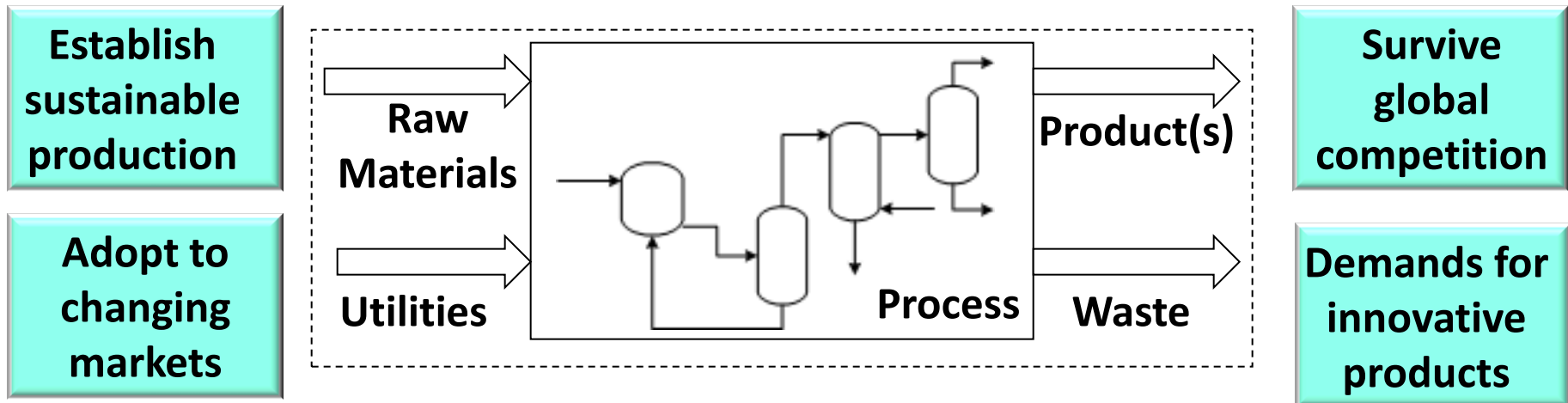
*Adopted from Cussler (2011)*

## How to find innovative solutions?



**Methyl acetate in multifunctional reactor (Eastman Chemicals)**

**Chemical and bio-based industry faces enormous challenges to achieve and/or respond to:**



## Processes need to be:

**Sustainable (Economically feasible; Reduced waste; Utility efficient; Environmentally acceptable); Safe; Operable; .....**

# Framework & Tool for Computer Aided Flowsheet Generation

ProCAFD - Computer Aided Flowsheet Design

Problem Definition | Mixture Analysis | Process-group selection | Generation of flowsheets | Ranking | Design & Analysis | Rigorous simulation

Add Compound

CAS no:

Chemname:

Formula:

Suggested compounds:

Add Compound *Click to select compound*

Selected Compounds

ProCAFD

Reaction Data

Reaction data

View Parameters

Add Inlets & Outlets

Add Inlet

Add Outlet

Property	Value
*	

Save

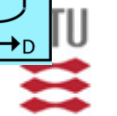
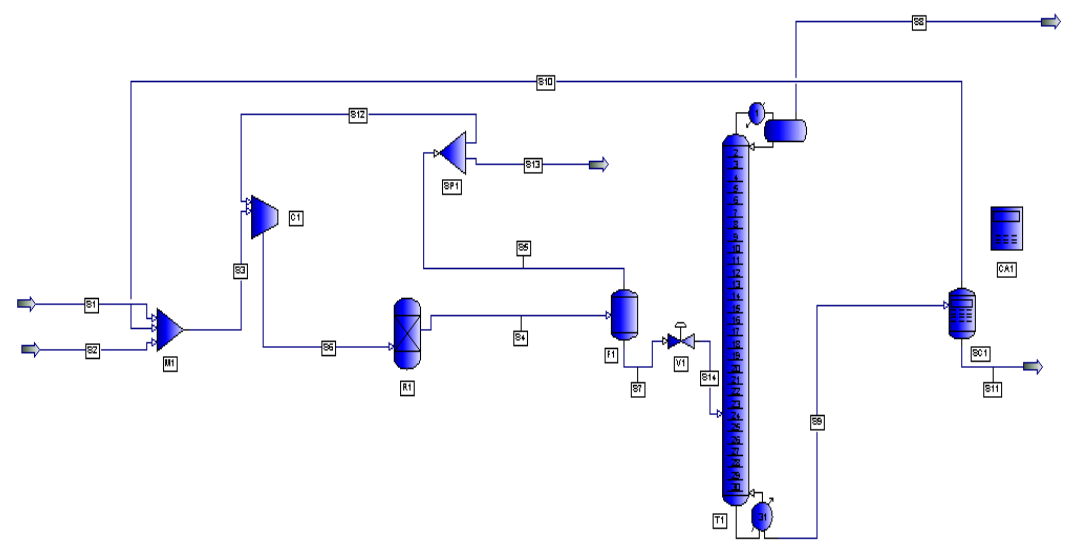
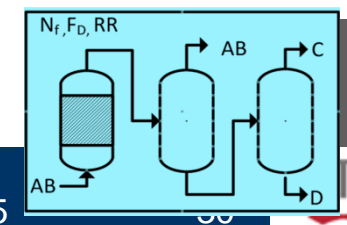
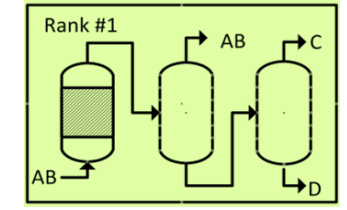
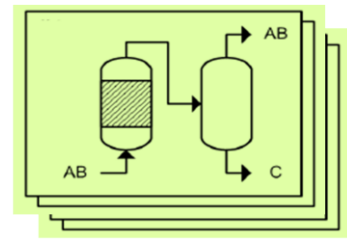
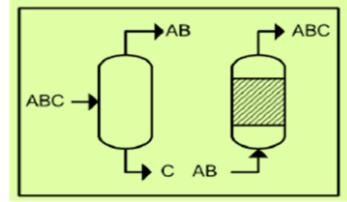
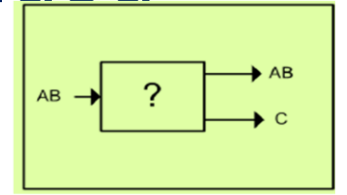
Next step (Mixture Analysis)

## A Computer-Aided Tool to:

- ❖ Generate all feasible process flow-sheets (To generate novel/innovative solutions).
- ❖ Quick & efficient evaluation of alternatives.
- ❖ Design & Analysis of Alternatives
- ❖ That requires minimal computation resources and expert knowledge.

## Framework & Tool for Computer Aided Flowsheet Generation

$$(iA)(rAB/pABCD) < 1 < 2 [ < (iB) ] (gmemABC/D) [ (oD) ] (A/BC) 1 (B/C) 2 (oC)$$



## The key chemical products

Commodities

Molecules

Microstructures

Key

**Cost**

**Speed**

**Function**

Basis

**Unit Ops**

**Chemistry**

**Microstructure**

Risk

**Feedstock**

**Discovery**

**Science**

## Skills Required?

*Adopted from Cussler (2011)*

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## Skills Required?

*Adopted from Cussler (2011)*



## Positive contribution to the modern society



*Survival of the modern society depends on the products from ChE*



**Jet-fuel blend**

**Gasoline blend**



**Liquid formulations & emulsions**

**Scientifically specified needs**

**Needs defined by consumer reactions**

## Is there a need for a product simulator?



## The chemical product simulator

**Templates**

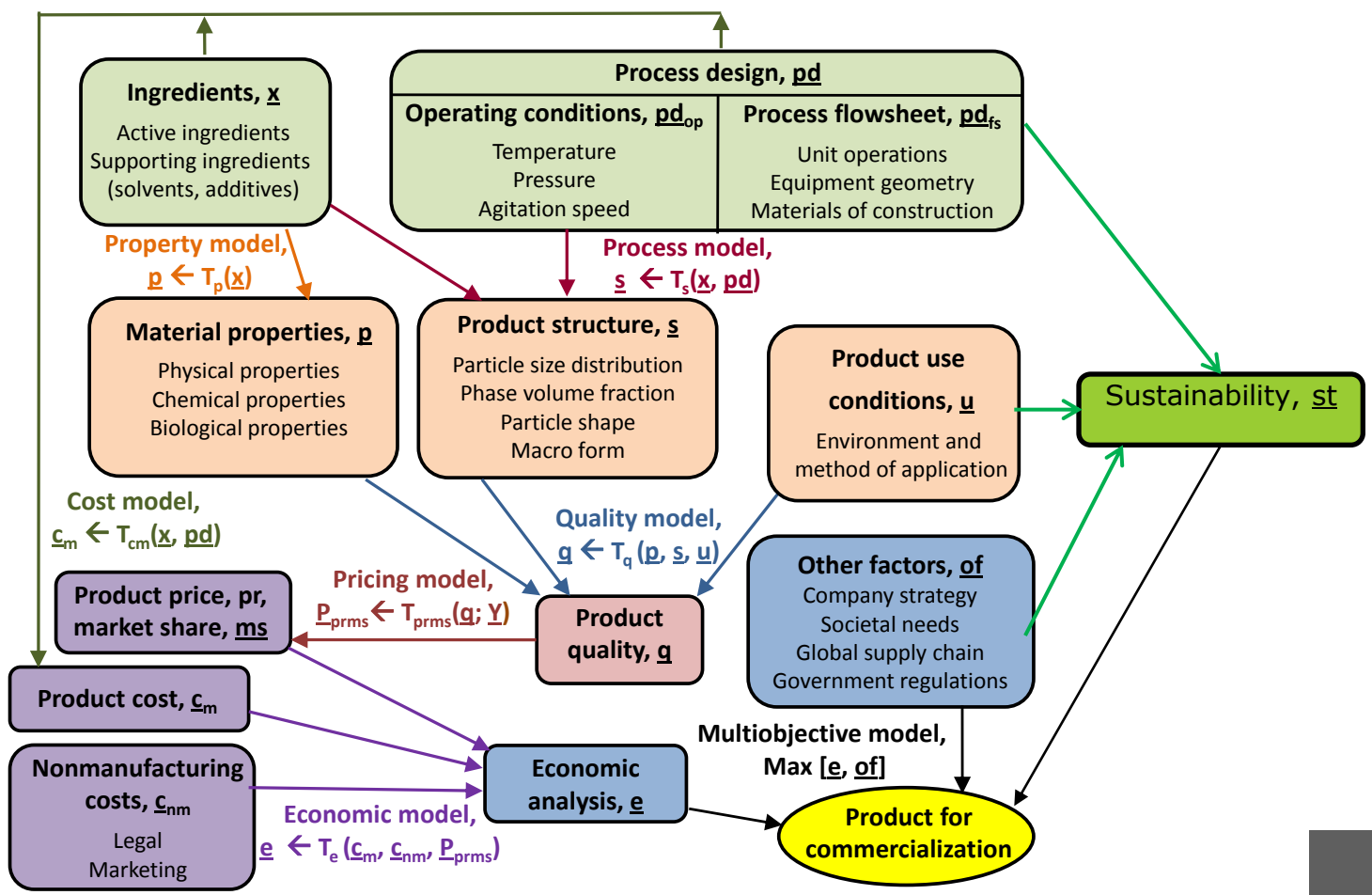
<b>Controlled Release</b> <p>Membrane, Core, Release medium</p>	<b>Uptake of Pesticides</b> <p>Surfactant in water, Droplet, Plant cuticle</p>	<b>Fuel Cell</b> <p>Hydrogen, Heat, Air, Water</p>
<b>Formulation</b> 	<b>Blends</b> 	<b>Emulsions</b> 
<b>Create New Template</b>		

**Help**

- Help Documents
- Open Solved Example
- Database Search

**Integrated Tools**

## The Grand Product Design Model?

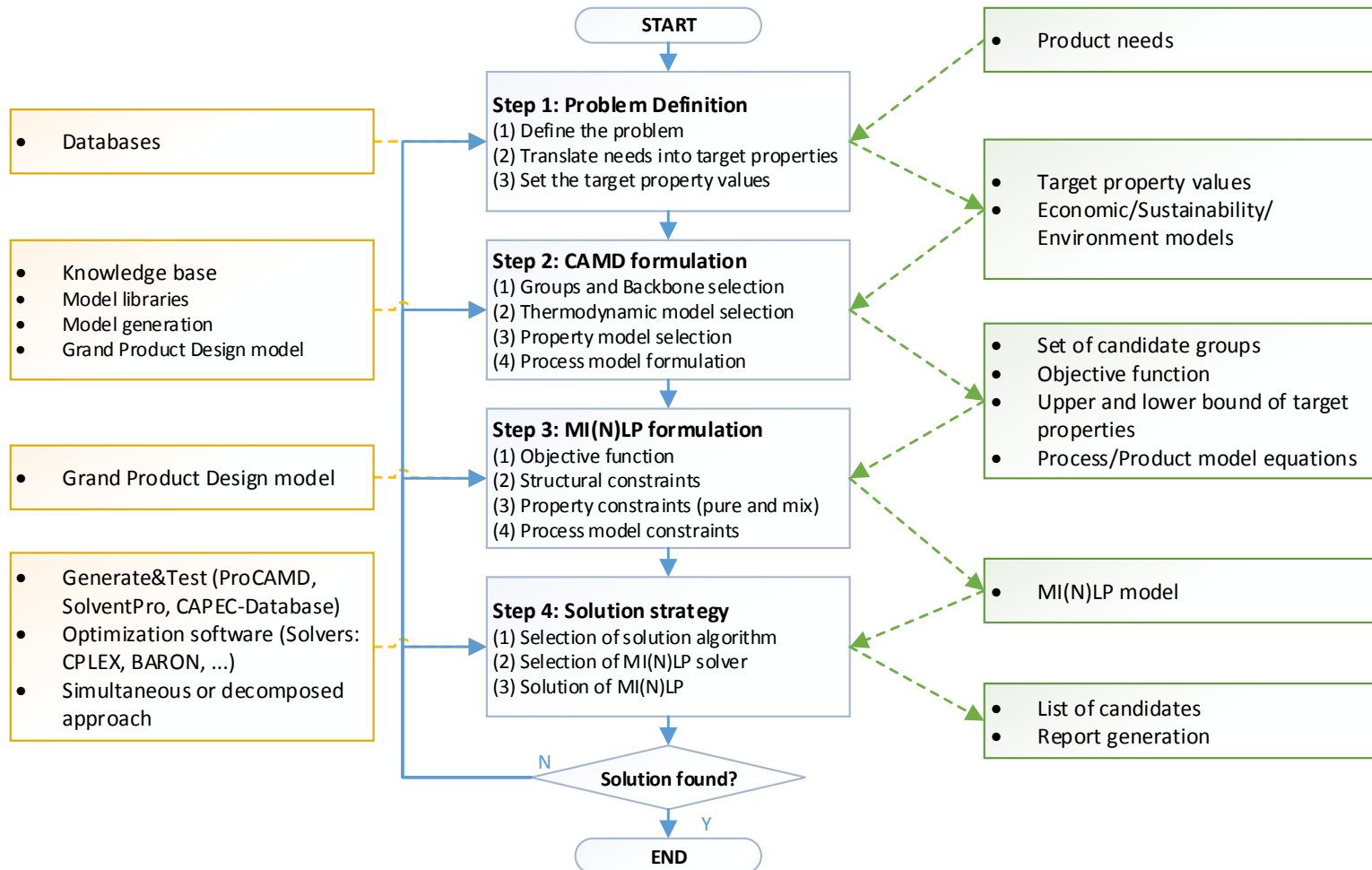


## The Mathematical Problem & Solution?

Methods and Tools

Work Flow

Information Flow



- **Should we look for solutions that are not so simulator specific?**
  - **Are simulators able to solve the problems we are interested in?**
- **Should we develop new model-based methods & tools?**
  - **Should we let the vendor companies develop the tools?**
- **How to find the innovative solutions we need?**
  - **Can this be done with the current tools?**
- **We (PSE-academia) need to take back the leadership role**

**Need to address the grand challenges – energy, water, food & environment**

**Need to look and develop beyond the current methods and tools**

**Need efficient management of the complexity is the key**

**Need to develop model based systems that provide truly innovative & new solutions**

.....



# Future Research Challenges in PSE

How do we go from here . . .

Azapagic 2013



Rafiqul Gani, Seminar-2, Babes-Bolyai University, Cluj-Napoca, 5 November 2015



# Future Research Challenges in PSE

..... Somewhere here?

Azapagic 2013

