#### **BIOPROCESS SIMULATION, ECONOMICS AND DESIGN**

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## PROCESS SYNTHESIS & PROCESS ANALYSIS

#### Where do you begin Process Design?



#### YOUR GOAL

**IF YOU DON'T KNOW** WHERE YOU ARE GOING AND YOU DON'T HAVE A **MEANS OF MEASURING WHERE** YOU ARE THEN YOU WON'T KNOW WHEN **YOU ARRIVE** 

#### **STEPS IN PROCESS DESIGN**

- 1. Product definition
  - Product specifications
  - Defines analytical needs
  - Market size
- 2. Select the synthetic technology
- 3. Create process flow diagram (PFD)
- 4. Material & energy balances to calculate costs
  - Materials (reagents and consumables)
  - Equipment
  - Utilities
  - Labor
- 5. Assess assumptions and uncertainty
- 6. Identify economic and quality hot spots
- 7. Assess profitability and risk
- 8. Create the R/D agenda

#### WHAT DO I WANT & NEED TO KNOW FOR PROCESS MODELING AND SIMULATION

- What is the cost of goods?
- What are the cost sensitive operating parameters?
- What are the assumptions and where is the uncertainty?
- Where are the economic hot spots?
- Where should one focus R&D?
- What is the impact of process change on cost and quality?
- Are there alternative processes?
- Where are the process bottlenecks?
- How can I increase throughput & profitability?

 $PROFIT = VF_{M} (S_{P}S_{A} - C_{M})$ 

#### WHEN SELECTING UNIT OPERATIONS THERE ARE CHOICES AND DECISIONS MUST BE MADE



#### **Overview**



#### **CASE STUDIES**

- Protein synthesis using mammalian cells for Monoclonal Antibody production
- Microbial process producing the antibiotic Penicillin
- Alkaline Protease production by microbial fermentation

#### **CASE OBJECTIVES**

- •Flowsheet formulation
- Material and energy balances
- •Equipment size estimation
- Estimation of capital costs
- Estimation of operating cost
- Profitability
- •Assay for the process

#### **Monoclonal Antibodies**

- In vitro use (antigen identification, antigen purification)
- In vivo use (therapeutic applications, diagnostic tools)
- Growing market: 2,400 kg in 2006 (Chovav et al., 2003)
- New MAb entering the market; in the biopharmaceutical development pipeline
- Need for new production facilities and optimization of existing plants

# **Penicillin V**



- Hydrophobic β-lactam
- Produced by Penicillium chrysogenum
- Penicillin G and V main penicillins of commerce
- Used a human medicine and in animal health
- Further processed to semi-synthetic penicillins
- Annual production penicillin: 65,000 tons
- Price penicillin V: \$11/BU, or \$17-18/kg

# 1. Estimation of Capital Investment

# **Types of Cost Estimates**



#### **Equipment Size and Cost**



## Fermenter Size/ Amount of Product

Plant size can be derived from:

- Volume and number of fermenters
- Annual amount of product to produce

Decision based on:

- Market Volume
- Technical feasibility
- Own business plan / competitor

#### **Process Flow Diagram: Penicillin**



# **Equipment Cost**

- Costs for major pieces of equipment in PFD
- Prices obtained from:
  - Vendor quotations
  - Previous projects
  - Literature (e.g. Peters et al.)
  - Default values simulation software
- Cost estimate for unlisted equipment

Peters, M., Timmerhaus, K. and West, R.: Plant design and economics for chemical engineers; McGraw Hill: Boston, 2003.

#### **Price Indices**

- Purpose: To estimate cost data from previous projects, analogous sources, different times, etc.
- Most frequently used *Prices Indices*:
  - Marshall & Swift Index (M&S Index)
  - Chemical Engineering Index
- Estimating the cost:

Present cost = (original cost) x (Index value Today)

(Index value at time original cost was obtained)

#### **Total Plant Direct Cost**



**Total Plant Direct Cost** 

\$89.3 Million

#### **Direct Fixed Capital Investment**



\$ 165.7 Million

**Direct Fixed Capital** 

#### **Total Capital Investment**



\* Covering labor, raw material, utilities and waste treatment cost

## **Economy of Scale**

• Six-Tenth Factor:

Derived from statistical/empirical data

 $K_2 = K_1 (P_2/P_1)^{0.6}$ 

K = investment cost; P = annual capacity

- Example: MAb:
  - 381 kg MAb per year, \$175 Million investment cost
  - Estimated investment cost for a 500 kg plant:  $K_2 = 175 (500/381)^{0.6} = $206$  Million

# Penicillin: Equipment Purchase Costs



# MAB: Allocation Equipment Cost to Sections



#### 2. Estimation Operating Cost

#### **Process Diagram**



#### **Raw Material Costs**

- Amount of a compound x its Price
- Possible sources:
  - Supplier
  - Internal data
  - Literature, e.g. Chemical Market Reporter
  - Sales catalogues
- Pricing is very dependent on source and volume

## Consumables

- Factors:
  - Amount per batch
  - Replacement frequency/ operating hours
  - Price
- Sources of data:
  - Experiments
  - Supplier data
  - Literature, default value simulation software
  - Estimates by analogy
- Major consumables:
  - adsorption/chromatography resins
  - membranes (filtrations, dialysis, diafiltration etc.)

#### Waste

- Waste treatment normally not part of the PFD
- Waste types and costs\*
  - Solid waste:
    - Non-hazardous: \$35/ton
    - Hazardous: \$145/ton
  - Liquid waste/wastewater: \$0.5/m<sup>3</sup>
  - Emissions: cost depend on composition
- Treatment mandated by environmental laws

<sup>\*</sup>Peters, M., Timmerhaus, K. and West, R.: Plant design and economics for chemical engineers; McGraw Hill: Boston, 2003.

# **Energy Consumption**

- Typical energy consumptions:
  - Process heating & cooling
  - HVAC
  - Evaporation/distillation
  - Bioreactor aeration, agitation
  - Centrifugation, cell disruption, etc.
- Utility costs:
  - Electricity: 4.5 ct/kWh
  - Steam: 4.40 \$/ton
  - Cooling water: 8 ct/m<sup>3</sup>

#### Labor Cost

- Amount of labor:
  - Calculated from demand for each process step
  - Defines the number of people per shift/number of shifts
- Hourly cost
  - Internal company average value
  - Literature, e.g. Peters et al. (2003):
    skilled labor: 34 \$/h
  - Bureau of Labor Statistics (www.bls.gov)

## **Depreciation**

- Depreciation cost = "pay back" of investment cost
- Depreciation period ≈ Life time of project: 3-10 years
- Depreciation method:
  - Straight line (same \$ every year)
  - Declining balance, e.g. MACRS

#### **Facility-Dependent Costs: MAb**



# **Operating Cost MAb**



#### 3. Uncertainty Analysis

#### **Uncertainty Analysis**



#### Penicillin: Worst + Best Case Scenario

<b>Objective Functions</b>	Worst Case	Base Case	Best Case
Unit production Cost [\$/kg]	28.0	16.0	10.5
EBITDA [\$ million]	-18	4.0	31

Scenarios based on chosen minimum and maximum values for input variables

## **Monte Carlo Simulation**

#### **Uncertain variables:**

#### **Objective functions:**



# Penicillin: Parameters for Monte Carlo Simulation

- Yield biomass on glucose
- Maintenance coefficient (glucose)
- Precursor utilization efficiency
- Final biomass concentration
- Final production concentration
- Aeration rate
- Agitator power

- Downstream recovery yields (each step)
- Recycling yields: butyl acetate, acetone
- Price glucose
- Price phenoxyacetic acid
- Electricity cost (\$/kWh)
- Selling price product

## Probability Distribution: Input Variables



Final product concentration: Normal distribution, Std.-Dev.: 10%





Agitator power: Normal distribution, Std.-Dev.: 20%, min: 1.5 kW/m<sup>3</sup>, max: 3.5 kW/m<sup>3</sup>

Price glucose:

Beta distribution,  $\alpha$  = 3.49;  $\beta$  = 1.2, Distribution type fits best actual data

#### Probability Distribution UPC: Technical Parameters



### Probability Distribution UPC Unit Cost



#### Production of Alkaline Protease for Detergent Use

Alkaline protease is an important additive for use in laundry detergents. The objective is to simulate the operation of a plant to produce 6,000 ton/y of crude enzyme (e.g. containing 250 tpa of pure protein). The plant will use five (5) 150 m<sup>3</sup> fermentors and operate with a 75 h process cycle time.

#### **Production of Alkaline Protease**



#### **Alkaline Protease**



## **Improving Titer**



# •INADEQUATE <u>ANALYTICAL</u> TECHNIQUES

#### •SIMPLISTIC MODELS WITH ASSUMPTIONS

#### •<u>VARIANCE</u> IN SIGNALS AND PERFORMANCE

INEFFICIENCIES IN <u>USE OF INFORMATION</u>

#### •INEFFICIENT LEARNING