

# Optimal facility location and equipment selection for whey reuse

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Jun 28, 2016

# Overview

- 1 **Whey Supply Chain**
- 2 Mathematical Formulation
- 3 Research Direction

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# Outline

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# Why Optimize Whey Supply Chain?

- A potentially important source of nutrients
- Disposing of whey in the environment is wasteful and pollutant
- High value-added products with applications in:
  - Dairy,
  - Meat,
  - Dry foods,
  - Bakery,
  - Confectionery,
  - Food supplements,
  - Drinks,
  - Pharmaceuticals,
  - ...



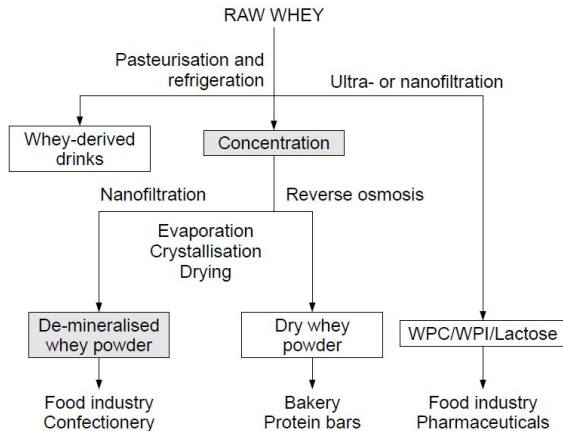
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# Possible processing paths

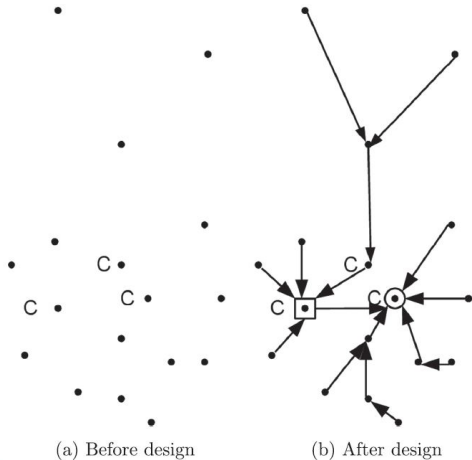
- 40% demineralized whey powder (40DWP)





# Whey supply chain

- Candidates (marked with a C)
- Collection centers (square)
- Plants (circle)
- Hierarchical system



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# Definitions

## Service

A **service** is a set of tasks that collection centers or plants perform.

## Stage

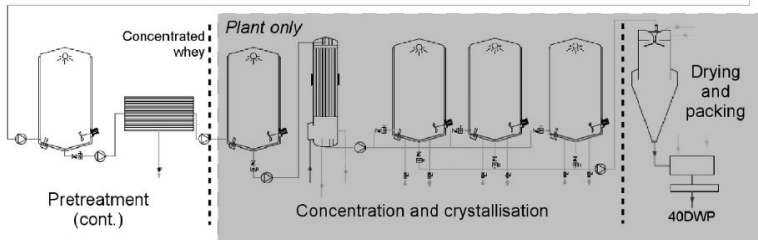
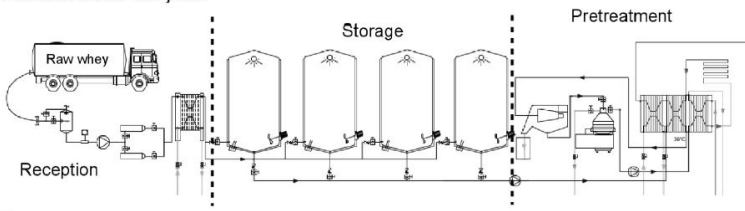
Each service consists of an ordered set of **stages** that form that service.

## Configuration

A valid combination of machines that perform stage operations (tasks) of a service is called a **configuration** of that service.

# 40DWP process diagram

Collection centre and plant



# Sets and Indexes

Notation	Definition
$n$	The number of nodes (cheese makers)
$N$	Set of nodes, i.e., $N = \{1, 2, \dots, n\}$
$V$	Set of candidate centers ( $V \subseteq N$ )
$i, j$	Indexes for the nodes
$H_i^c$	Set of all configurations available for a collection center located in $i \in V$
$H_i^p$	Set of all configurations available for a plant located in $i \in V$
$h$	Index for the configurations

# Continuous Variables

## We have three types of flows

- $x_{ij}^{rc} :=$   
Raw whey transported from cheese maker  $i \in N$  to collection center  $j \in V$
- $x_{ij}^{rp} :=$   
Raw whey transported from cheese maker  $i \in N$  to plant  $j \in V$
- $x_{ij}^{cp} :=$   
Concentrated whey transported from collection center  $i \in V$  to plant  $j \in V$

# Continuous Variables

## We have three types of production

- 1**  $y_{ih}^{rc} :=$   
Concentrated whey produced from raw whey in collection center  $i \in V$  by configuration  $h \in H_i^c$
- 2**  $y_{ih}^{rp} :=$   
40DWP produced from raw whey in plant  $i \in V$  by configuration  $h \in H_i^p$
- 3**  $y_{ih}^{cp} :=$   
40DWP produced from concentrated whey in plant  $i \in V$  by configuration  $h \in H_i^p$

# Binary Variables

## We have two types of binary variables

$$z_{ih}^c := \begin{cases} 1 & \text{If a collection center is located in node} \\ & i \in V \text{ using configuration } h \in H_i^c, \\ 0 & \text{Otherwise.} \end{cases}$$

$$z_{ih}^p := \begin{cases} 1 & \text{If a plant is located in node } i \in V \text{ using} \\ & \text{configuration } h \in H_i^p, \\ 0 & \text{Otherwise.} \end{cases}$$



# Objective function

We maximize total profit

$$\begin{aligned}
 \max \quad & s \sum_{i \in V} \sum_{h \in H_i^p} (y_{ih}^{rp} + y_{ih}^{cp}) \\
 & - \sum_{i \in V} \sum_{h \in H_i^c} O_{ih}^{rc} y_{ih}^{rc} - \sum_{i \in V} \sum_{h \in H_i^p} (O_{ih}^{rp} y_{ih}^{rp} + O_{ih}^{cp} y_{ih}^{cp}) \\
 & - \sum_{i \in V} \sum_{j \in V} T_{ij}^c x_{ij}^{cp} - \sum_{i \in N} \sum_{j \in V} T_{ij}^r (x_{ij}^{rc} + x_{ij}^{rp}) \quad (1)
 \end{aligned}$$

# Constraints

At most one facility with only one configuration

$$\sum_{h \in H_j^c} z_{jh}^c + \sum_{h \in H_j^p} z_{jh}^p \leq 1 \quad \forall j \in V \quad (2)$$

## Constraints . . .

Total installation cost must not exceed the given budget

$$\sum_{i \in V} \sum_{h \in H_i^c} F_{ih}^c z_{ih}^c + \sum_{i \in V} \sum_{h \in H_i^p} F_{ih}^p z_{ih}^p \leq B \quad (3)$$

## Constraints ...

Raw whey produced by all cheese makers must enter the supply chain

$$\sum_{i \in V} (x_{ji}^{rc} + x_{ji}^{rp}) = w_j \quad \forall j \in N \quad (4)$$

## Constraints ...

A known fraction of input raw whey is converted to concentrated whey in a collection center

$$\alpha \sum_{i \in N} x_{ij}^{rc} = \sum_{h \in H_j^c} y_{jh}^{rc} \quad \forall j \in V \quad (5)$$

## Constraints . . .

A known fraction of input concentrated whey is converted to 40DWP in a plant

$$\beta \sum_{i \in V} x_{ij}^{cp} = \sum_{h \in H_j^p} y_{jh}^{cp} \quad \forall j \in V \quad (6)$$

## Constraints . . .

A known fraction of input raw whey is converted to 40DWP in a plant

$$\alpha\beta \sum_{i \in N} x_{ij}^{rp} = \sum_{h \in H_j^p} y_{jh}^{rp} \quad \forall j \in V \quad (7)$$

## Constraints . . .

Concentrated whey produced in a collection center must go to plants for further processing

$$\sum_{h \in H_j^c} y_{jh}^{rc} = \sum_{i \in V} x_{ji}^{cp} \quad \forall j \in V \quad (8)$$



## Constraints . . .

Each configuration of a collection center allows us to produce at most a specific amount of concentrated whey

$$y_{jh}^{rc} \leq U_{jh}^c z_{jh}^c \quad \forall j \in V, h \in H_j^c \quad (9)$$

## Constraints . . .

Each configuration of a plant allows us to produce at most a specific amount of 40DWP

$$y_{jh}^{rp} + y_{jh}^{cp} \leq U_{jh}^p z_{jh}^p \quad \forall j \in V, h \in H_j^p \quad (10)$$

## Constraints . . .

Concentration of raw whey will not take place in a collection center unless the required minimum capacity is met

$$y_{jh}^{rc} \geq L_j^c z_{jh}^c \quad \forall j \in V, h \in H_j^c \quad (11)$$

## Constraints . . .

Production of 40DWP will not take place in a plant unless at least a specific amount of 40DWP is produced

$$y_{jh}^{rp} + y_{jh}^{cp} \geq L_j^p z_{jh}^p \quad \forall j \in V, h \in H_j^p \quad (12)$$

# Constraints . . .

## Domain of variables

$$z_{jh}^c \in \{0, 1\} \quad \forall j \in V, h \in H_j^c \quad (13)$$

$$z_{jh}^p \in \{0, 1\} \quad \forall j \in V, h \in H_j^p \quad (14)$$

$$y_{jh}^{rc} \geq 0 \quad \forall j \in V, h \in H_j^c \quad (15)$$

$$y_{jh}^{rp} \geq 0 \quad \forall j \in V, h \in H_j^p \quad (16)$$

$$y_{jh}^{cp} \geq 0 \quad \forall j \in V, h \in H_j^p \quad (17)$$

$$x_{ij}^{rc} \geq 0 \quad \forall i \in N, j \in V \quad (18)$$

$$x_{ij}^{rp} \geq 0 \quad \forall i \in N, j \in V \quad (19)$$

$$x_{ij}^{cp} \geq 0 \quad \forall i \in V, j \in V \quad (20)$$

# How to solve it?

- It is a mixed integer **linear** program
- We just need to use a state-of-the-art linear solver



- Real world case (see reference):
  - The actual whey supply chain model has 52 nodes with 10 candidate centers.
  - It has been solved using both LP Solve 5.5.2 and CPLEX 12.5 in around 2 minutes.

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# Consideration of uncertainty

- Uncertainty in which parameters?
  - Budget available for construction,
  - The transportation costs,
  - Selling price of our commercial product(s)
  - The availability of configurations,
  - ...
  
- Which approach to take?
  - Stochastic Programming
  - Robust Optimization



## Reference and contact information



Rodolfo Garcia-Flores, Ricardo Martins, Osmar Vieira de Souza Filho, Marcelo Gonzalez, Carlos Mattos, Amauri Rosenthal and Pablo Juliano  
A novel facility and equipment selection model for whey utilisation: A Brazilian case study, Computers and Electronics in Agriculture. 2015 (117), 127 – 140.

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# Thank You