



# **Design and Scheduling of Flexible Processing Systems: An Optimization Approach**

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Iberian Conference in Optimization, Coimbra, Nov. 2006, Ana Póvoa



## **Overview**

- Objective
- Flexible Processing Systems
- Problems & Challenges
- Systems Approach
  - Processes, Resources, Operating Conditions
- Generic Problems Representations
- Scheduling
- Design
- Supply Chains
- Conclusions & Future Work

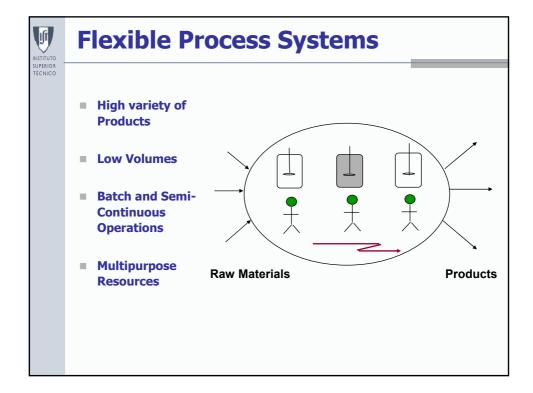


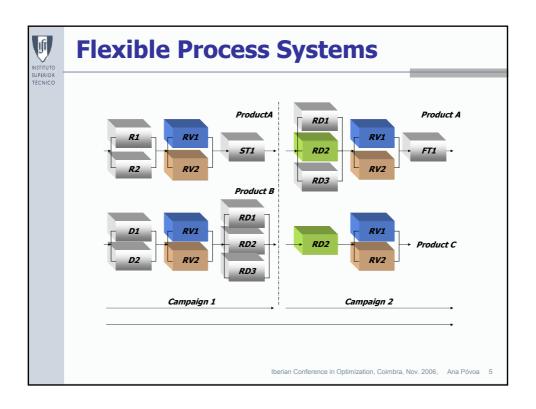
# **Objective**

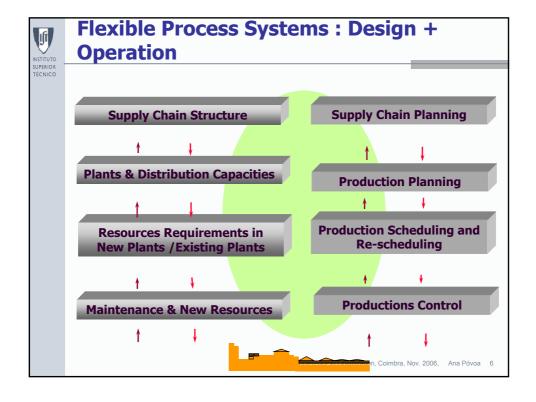
Develop generic models for the design and scheduling of flexible process systems



# **Solution of Real Problems**









## **Process Industries: Motivation**



- Diversity of Applications
- Complex Production Processes
- Improvement of Processes Efficiency
- Client Satisfaction
- Costs Reduction



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# **Problems & Challenges**

- How to design these plants?
- How to manage the plants resources?
- How to design and manage the associated supply chains?

SYSTEMS APPROCH OPTIMIZATION...



# **The Model**

- Develop the model for the problem;
  - Parameters definition
  - Sets definition
  - Variables definition
    - Binary (ex. Use or not the resource ?)
    - Continuous (ex. Batch sizes ?)
  - Constraints definitions
  - Objective definition



Complex Optimization Problems
Mixed Integer Linear/Non-Linear
Formulations
(MILPs & MINLPs)

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## **Solution Methods**

- Heuristics generic rules used to evaluate alternatives (FIFO, ...).
- Meta-Heuristics algorithms (e.g. simulate annealing, Tabu search, Ant colony, ...).
- Artificial Intelligence Ruled based methods, agent methods.
- Constraint Programming
- Mathematical Programming MILPs and MINLPs models, use of optimization algorithms (e.g. GAMS/CPLEX, XPRESS)



Combination of Methods (Hybrid)



# **Key Components**

- **Tasks** activities that *transform* the materials:
  - Processing
  - Storage
  - Transport ...
- **Resources:** 
  - Processing and storage equipments,
  - Transport
  - Man-power
  - Utilities ...
- Time:
  - External Production versus external demand
  - Internal Production Planning & Scheduling

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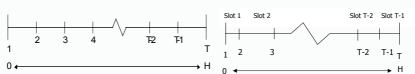
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## **Treatment of time**

- The activities (tasks) must occur such that the problem objectives are attained and no restrictions are violated
  - The use of the resources by the tasks and its availability along time must be analyzed

#### Discrete Time

#### **Continuous Time**





# **Discrete vs. Continuous Time**

#### Discrete Time

- Tight mathematical formulations
- Large models small discretisation of time
- Processing times independent of the batches.

#### Continuous Time

- Loose mathematical formulations
- Smaller models less points within the time grid
- Time grid points determined by the model
- Processing times may be dependent of the batches

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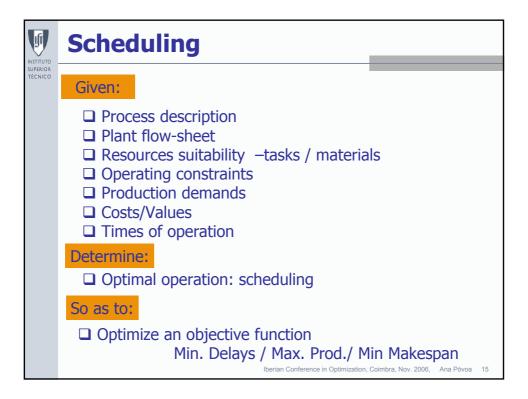


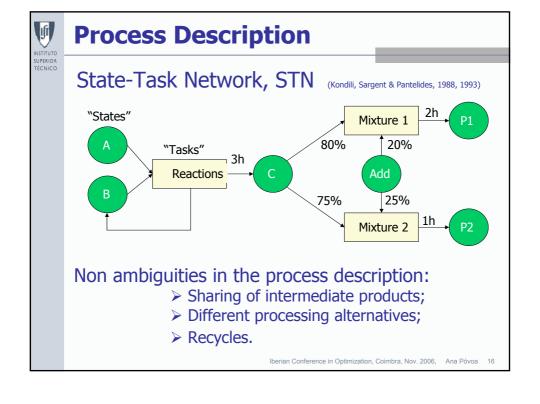
# **Problems Representation**

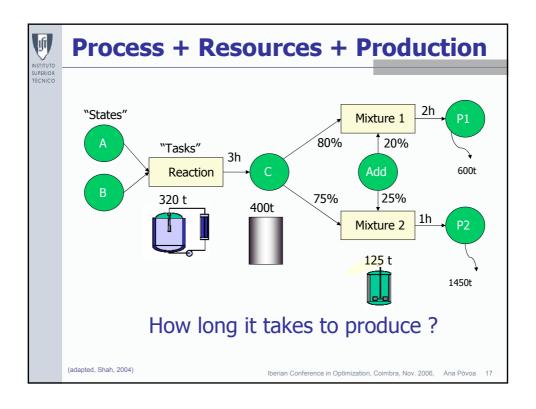
Problems are very complex and very diverse ... need a diverse set of techniques to match problem characteristics

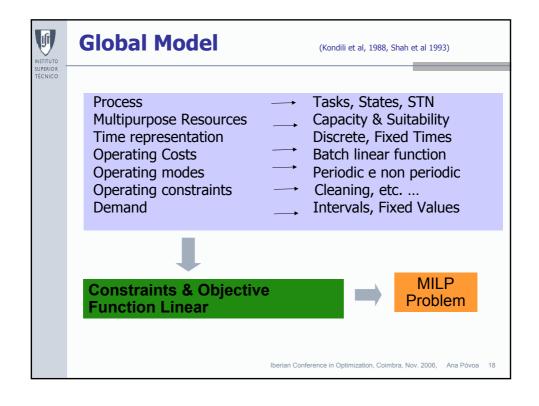
OR

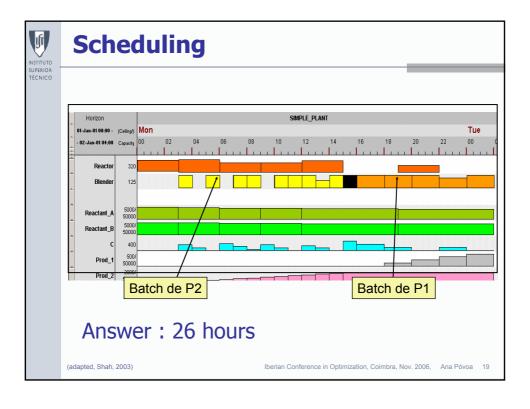
Distinctions between different industrial design & scheduling problems are not really sharp ... uniform representations can be used

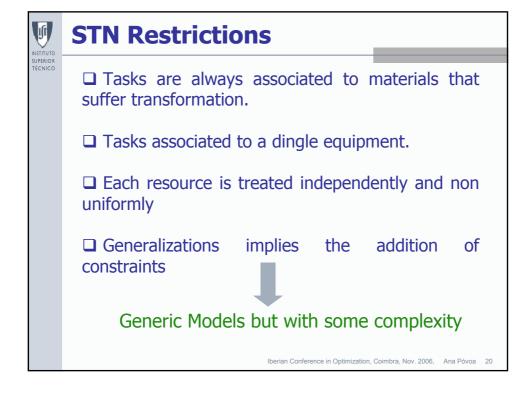














## **Resource -Task Network, RTN**

(Pantelides, 1994)

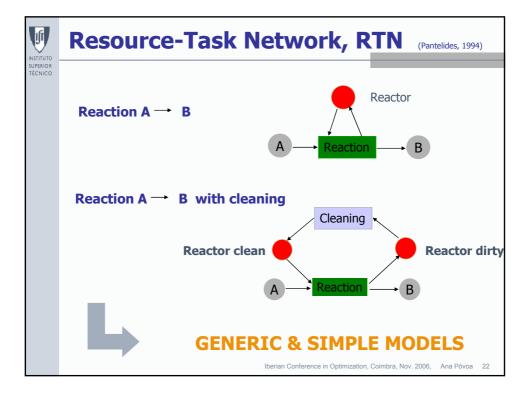
- Uniform treatment of all resources
  - Materials
  - Processing & Storage equipment
  - Utilities & Man-power
  - Connections
  - Transport resources ...





Tasks

- Classified accordingly to its functionality
- All resources of the same class have the same functionality
- Abstract operation that consumes & produces resources





## Formulations: STN versus RTN

$$\begin{split} &MaxPR = \sum_{S \in SP} \left[ \left( S_{S,H+1} - S_{S,0} \right) \cdot v_S + \sum_{t} D_{S,t} \cdot v_S \right] \\ &\text{s.t.} \\ &\sum_{i \in I} \sum_{j}^{t} \sum_{t' = t - p_j + 1 \geq 1}^{t} W_{i,j,t'} \leq 1 \quad \forall \ j, t = 1, \dots, H \\ &0 \leq S_{st} \leq C_s \qquad \forall s, t = 1, \dots, H \\ &V_{g}^{\min} W_{gt} \leq B_{ijt} \leq W_{gt} \cdot V_{g}^{\max} \qquad \forall i, j \in K_i, t = 1, \dots, H \\ &0 \leq U_{st} \leq U_{u}^{\max} \qquad \forall u, t = 1, \dots, H \\ &U_{ut} = \sum_{i} \sum_{j \in K_i} \left( \alpha_{ut} W_{gi} + \beta_{ut} B_{gi} \right) \qquad \forall u, t = 1, \dots, H \\ &S_{S,t} = S_{S,t-1} + \sum_{i \in I_r} \overline{\rho}_{it} \sum_{j \in K_i} B_{i,j,t} - \overline{\tau}_i + \sum_{i \in I_r} \rho_{it} \sum_{j \in K_i} B_{i,j,t} \sum_{t'} - D_{S,t} + R_{S,t'} \\ &\forall \ s, \ t = 1, \dots, H + 1 \end{split}$$

 $S_{st}, W_{iit}, B_{iit}, D_{st}, R_{st}$ 

$$\begin{split} \mathit{MaxPR} &= \sum_{r \in RP} \bigg[ \bigg( R_{r,H+1} - R_{s,0} \bigg) . vr + \sum_{t} \Pi_{r,t} . v_r \bigg] \\ &\text{S.t.} \\ \\ &0 \leq R_{rt} \leq R_{rt}^{\max} \qquad \forall r,t = 1,...,H \\ \\ V_{kr}^{\min} N_{kt} \leq \xi_{kt} \leq N_{kt} . V_{kr}^{\max} \qquad \forall k,r \in PE_{k},t = 1,...,H \\ \\ R_{r,t} &= R_{s,t-1} + \sum_{k} \sum_{\theta=0}^{r_{t}} \bigg( \mu_{kr\theta} N_{k,t-\theta} + \upsilon_{kr\theta} \xi_{k,t-\theta} \bigg) + \Pi_{rt} \\ \\ \forall r,t &= 1,...,H+1 \end{split}$$

$$R_{rt}, N_{kt}, \xi_{kt}, \Pi_{rt}$$

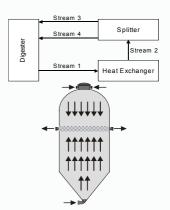
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# **Scheduling: Caima Pulp Mill**

(Castro, Barbosa-Póvoa e Matos, 2002)

- Four Digesters operating in batch mode (D3, D4, D5 e D6)
- **Vapor resource limitation**



What is the optimal digesters sequence that maximizes production while account for vapor limitations?



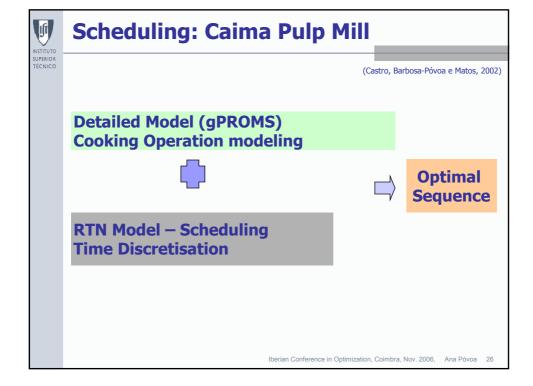
## **Scheduling: Caima Pulp Mill**

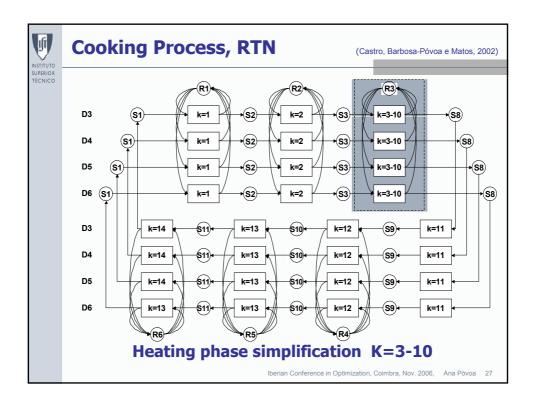
(Castro, Barbosa-Póvoa e Matos, 2002)

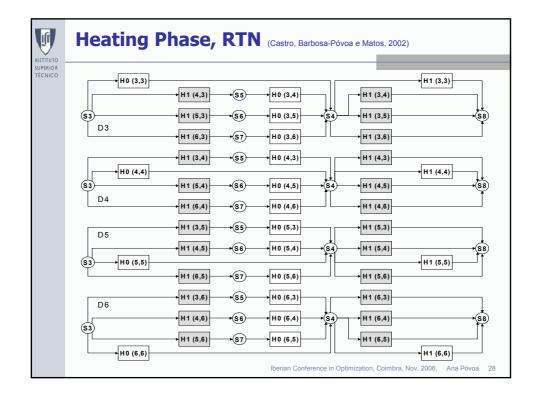
#### **Process:**

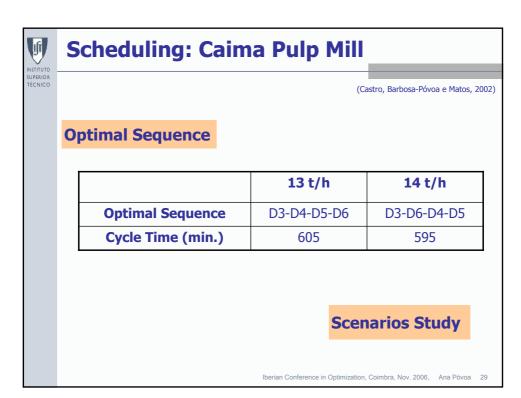
- 1 Chip filling;
- 2 Acid filling
- 3 Heating (55°C to 130°C)
- 4 Cooking
- 5 Degasification (high & low pressure)
- 6 Blowing

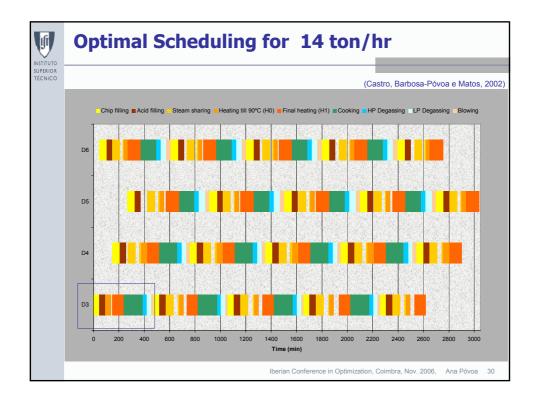
Cyclic Operation – sequence that is repeated













## Flexible Systems Scheduling

(Shah, 1998, Floudas & Lin, 2004, Mendez et al., 2005)

- Generic & Flexible Representations
- Detailed Models

#### BUT IS MISSING ....

- Dynamic Scheduling treatment
- Uncertainty study
- Explore more efficient solution methods complex problems
- Real cases solution

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## **Design / Retrofit**

#### Given:

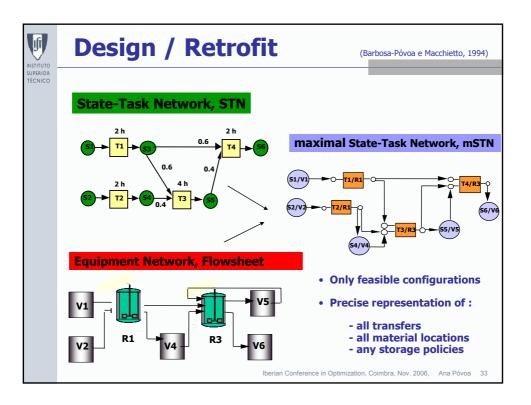
- □ Process Description
- ☐ Plant Superstructure: Equipment & Topology
- ☐ Equipment Suitability —Tasks/Materials
- Operational constraints
- Demands
- ☐ Operating & Investment Costs/Values
- Operation times

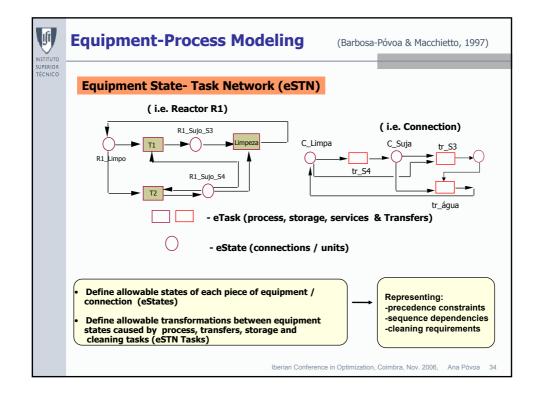
#### Determine:

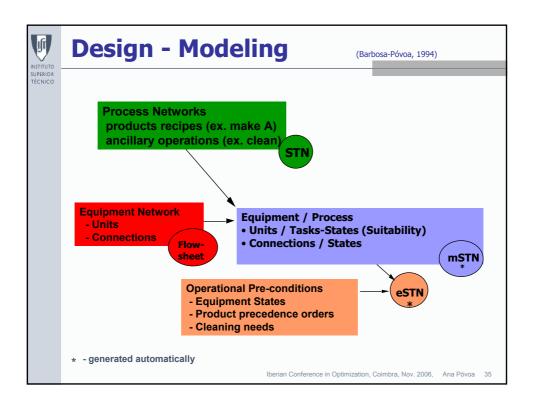
- ☐ Plant design: Equipment & Topology
- Optimal Operation : scheduling

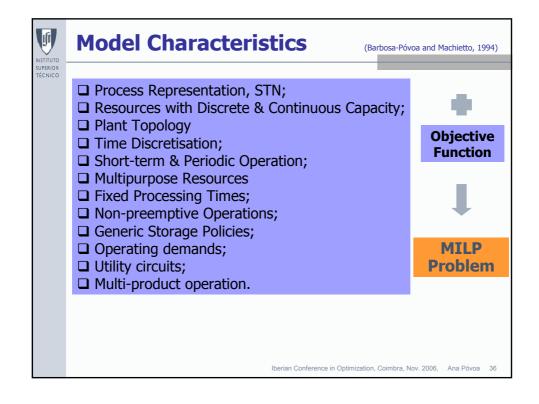
#### So as to:

Optimize and Objective Function Min. Costs / Max. Profit











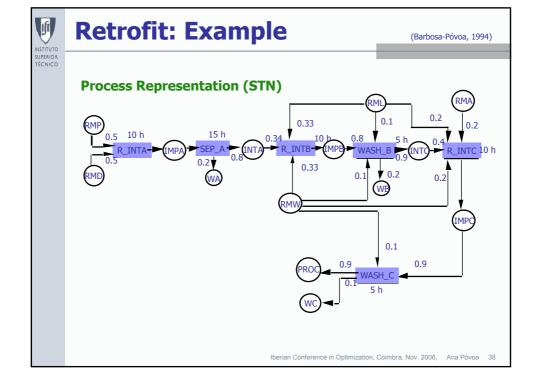
# **Retrofit: Example**

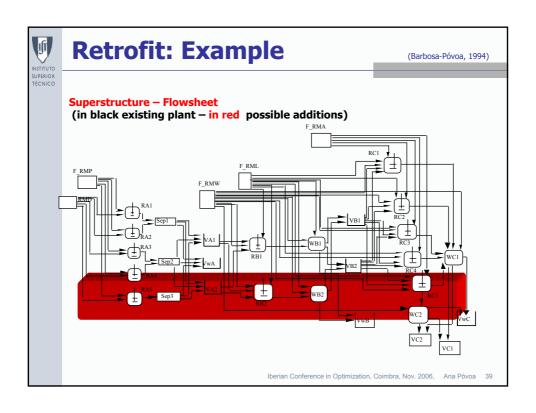
(Barbosa-Póvoa, 1994)

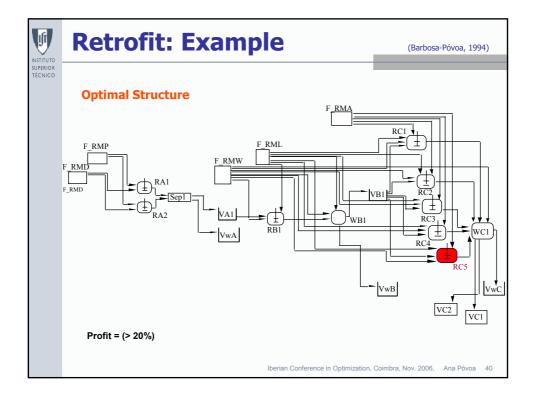
**Expand Existence Capacity ???** 

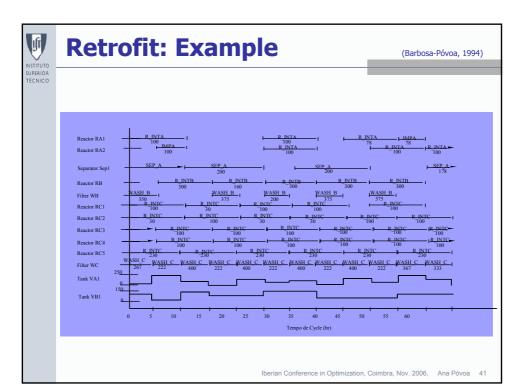
If Profitable???

- How to expand ???
- How much it costs ???











# **Design & Retrofit - RTN**

- Generic Models
  - Plants Topology
  - Multipurpose Resources
  - Operating Constraints
  - Discrete & Continuous Capacities
  - Cyclic & Short Term Operation
  - Time
    - Discrete (Pinto, Barbosa-Póvoa e Novais, 2005)
    - Continuous (Castro, Barbosa-Póvoa e Novais, 2005)



## **Investment in the models applications**



# **Design of Flexible Systems**

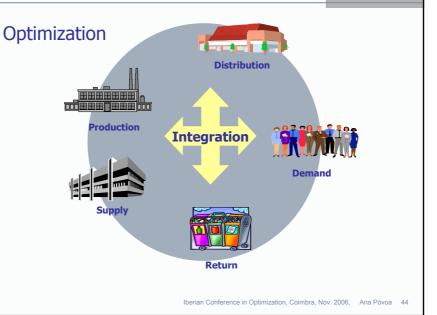
(Barbosa-Póvoa, 2006)

- Details models but exists space for much more :
  - Multi-level models (design, planning & scheduling)
  - Multi-objective models
  - Uncertainty modeling
  - Explore more efficient solution methods
- Explore the solutions of real cases

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# **Supply Chain**





# **Optimization Opportunities**

- The supply chains are difficult to understand
- Decisions are frequently based on common sense



- Optimization tools allow the possibility of looking in an integrated form to:
  - Design & Operational decisions

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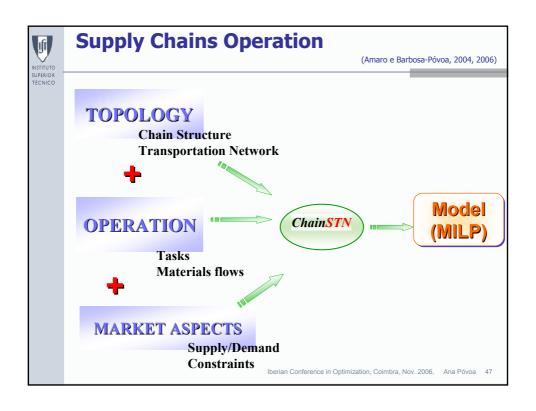


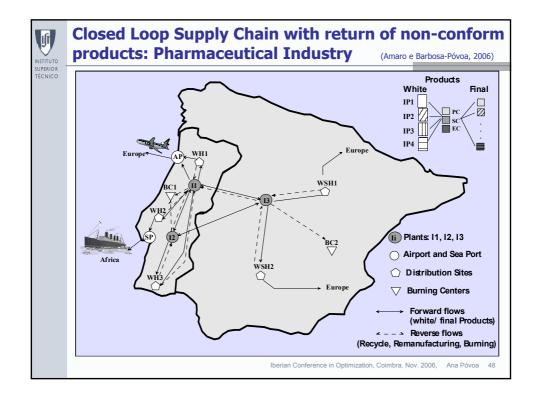
# **Supply Chains**

- Previous representations can be extended to the supply chain
- Knowledge obtained within the design and scheduling problems should be used.



- Models
  - Detailed and able to capture interactions
  - Deal with uncertainty
  - Dynamic & Flexible
  - Extensible







#### **Closed Loop Supply Chain with return of non-conform** products: Pharmaceutical Industry

(Amaro e Barbosa-Póvoa, 2006)

#### **Main Operations**

**Production** – intermediate medicines production (not for sale) involves essentially operations like:

> sterilization, components calibration, mixing, etc.

**Customization** – considers operations as:

filling, blistering, packing, etc.

**Distribution and Supply** – considers operations as:

storing. distribution.

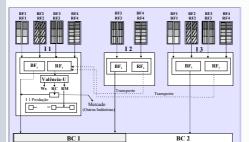
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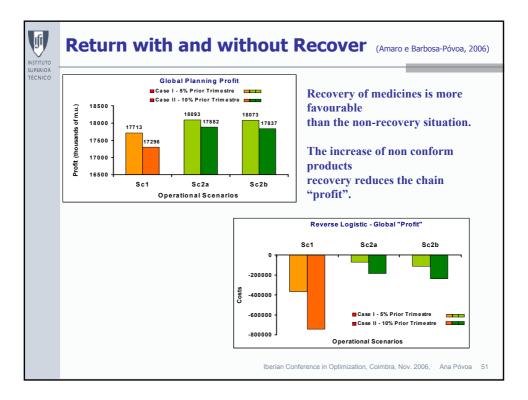
#### **Closed Loop Supply Chain with return of non-conform** products: Pharmaceutical Industry (Amaro e Barbosa-Póvoa, 2006)

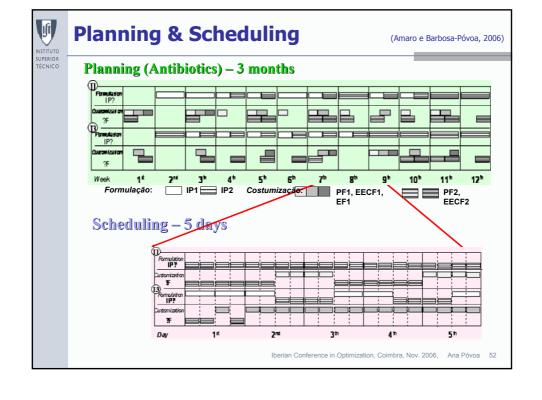
BF1 BF2 BF3 BF4 I 2 13 I 1 BC 1 BC 2

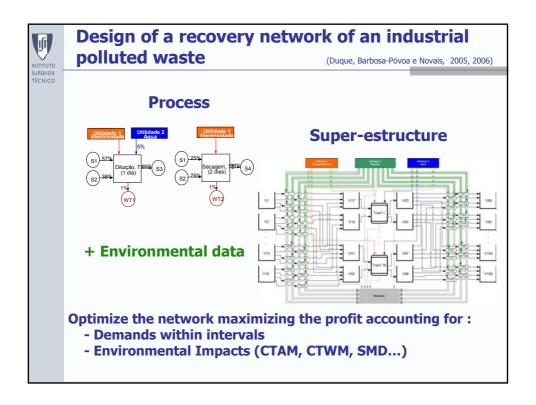
Scenario 1 – no recover, Burning (SC1)

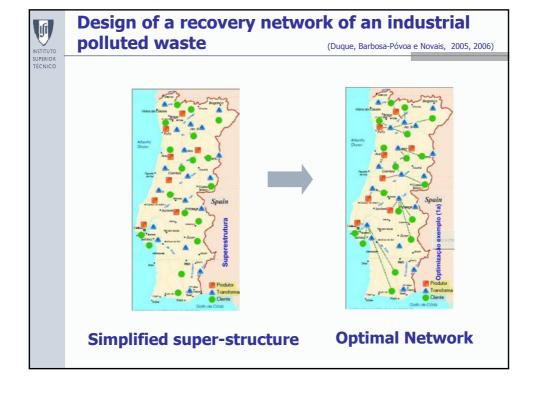


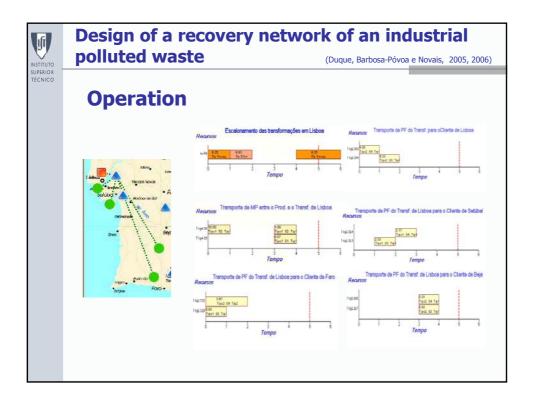
Scenario 2 – recover, without minimums (SC2) with minimums (SC3)



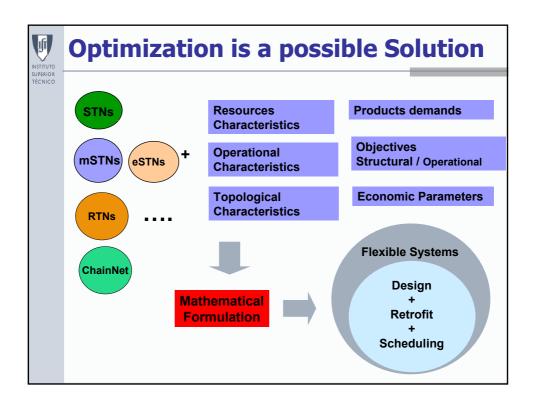


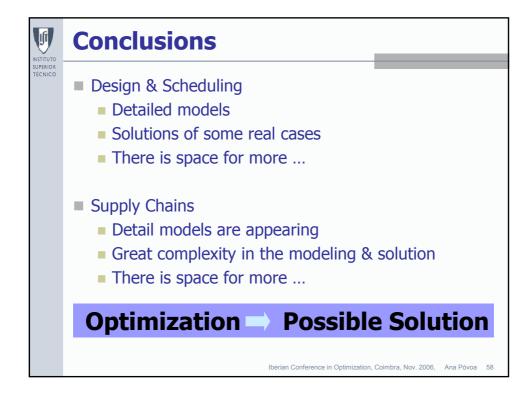














## **Future**

- Fill the "GAP" between research & its application
- Explore solution methods more efficiently :
  - Hybrid methods

Heuristics + MILPs

Meta-Heuristics + MILPS

Constraint Programming + MILPs

- Integrated different decision levels
- Explore environmental impacts
- Uncertainty

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