

# *Multi-objective Optimisation of Pretreatment of Sugarcane Bagasse for Bioethanol Production*

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# South African Context

Sugarcane bagasse (SCB)

Used to produce steam

3.3 Mt/year (Lynd et al., 2003)

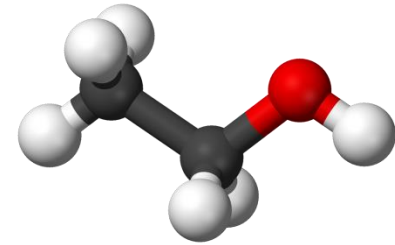




# Project Overview



Sugarcane bagasse



Ethanol

## Lignocellulose

40% cellulose

(polymer of glucose, C6)

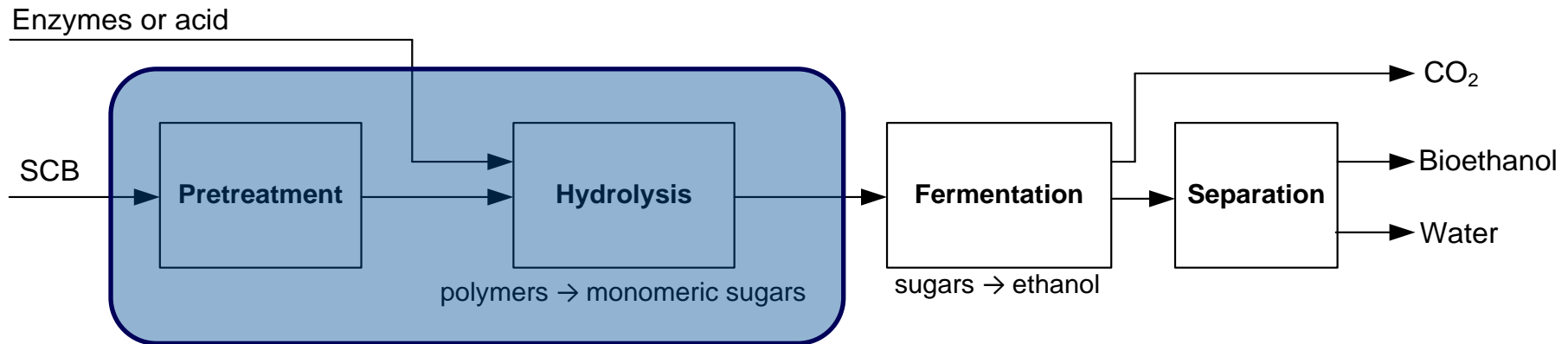
22% lignin

(aromatic polymer)

20% hemicellulose

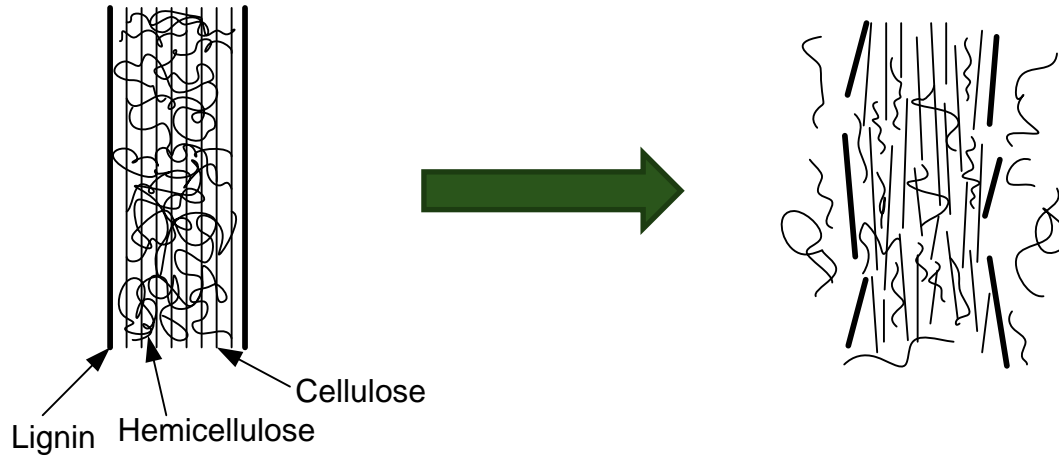
(branched polymer of C5 & C6 sugars)

# Project Overview



**Aim:** To use modelling to optimise the process flowsheet for pretreatment and hydrolysis in terms of both economic and environmental objectives.

# Pretreatment

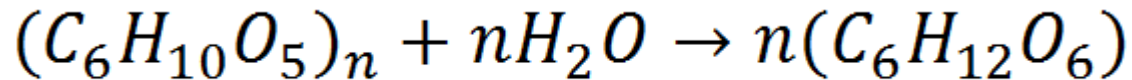


Biological, physical, chemical, physicochemical



# Hydrolysis

- Breaking polysaccharides into monomers using water



- Enzymatic
  - pH 4.8, atm P, T of 45 – 50°C
  - May require detoxification before
- Chemical
  - Using acid, atm P, T of 180 - 230°C
  - Produce more inhibitors to fermentation

# Modelling

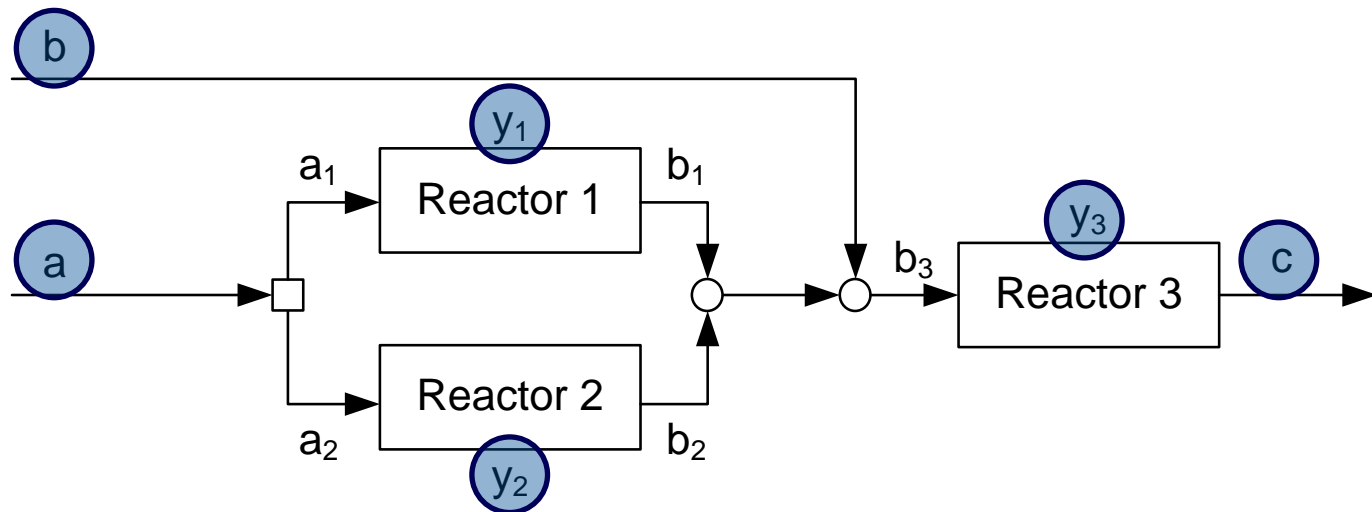
## *Why modelling?*

- Process design is usually uses a sequential approach
- Modelling uses a simultaneous approach
  - Interactions can be taken into account and optimised

# Modelling

## *Superstructures*

Can be used to embed many possible flowsheets into one model





# Modelling

*General process synthesis problem formulation*

$$z(y^K) = \min_x c^T y^K + f(x)$$

Such that:  $g(x) \leq 0$

$$h(x) = 0$$

$$A x = a$$

$$B y^K + C x \leq d$$

$$x \in X = \{x | x \in R^n, x_L \leq x \leq x_U\}$$

$$y^K \in Y = \{y^K | y^K \in \{0,1\}^m, E y^K \leq e\}$$

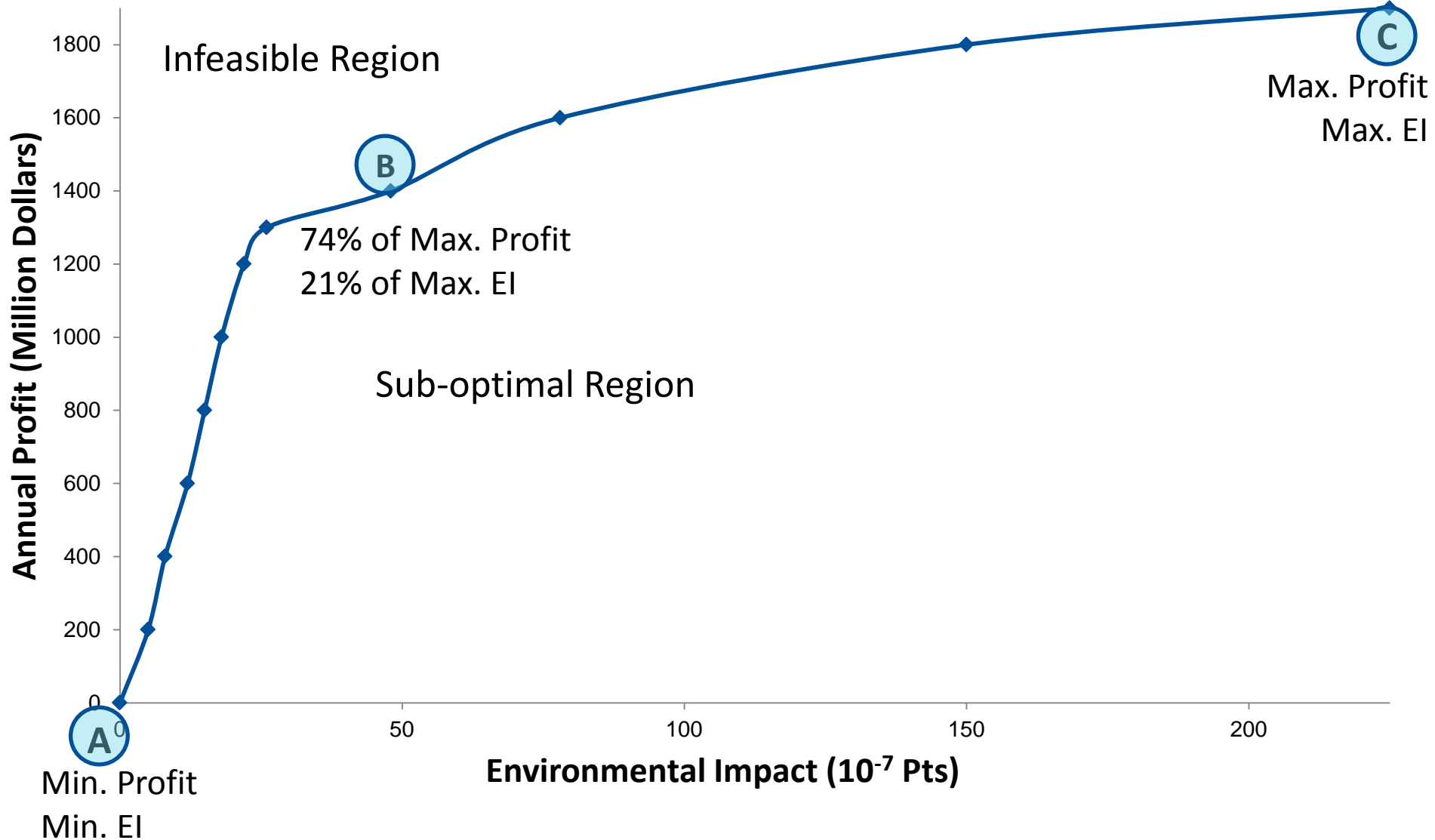
Mixed Integer Non-Linear Problem (**MINLP**)

# Environmental Impact

SimaPro using a liquid fuels database.



# Multi-Objective Optimisation



# Chosen Pretreatments

## **Pretreatment:**

Steam explosion (acid catalysed & uncatalysed)  
Acid pretreatment

## **Delignification:**

Using NaOH

## **Hydrolysis:**

Acid

Enzymatic

# Steam Explosion Model

*Mass balance of pilot-scale pretreatment of sugarcane bagasse by steam explosion followed by alkaline delignification.*

Rocha, G. J. M., Martín, C., Vinícius, F. N., Gómez, E. O., & Gonçalves, A. R.

- CTBE's Aspen simulation based on Rocha's paper.
  - Uncatalysed, 11 barg, 190°C
  - Acid catalysed, 5 barg, 150°C
- Conversions for individual reactions.
- Used in General Algebraic Modelling Software (GAMS).

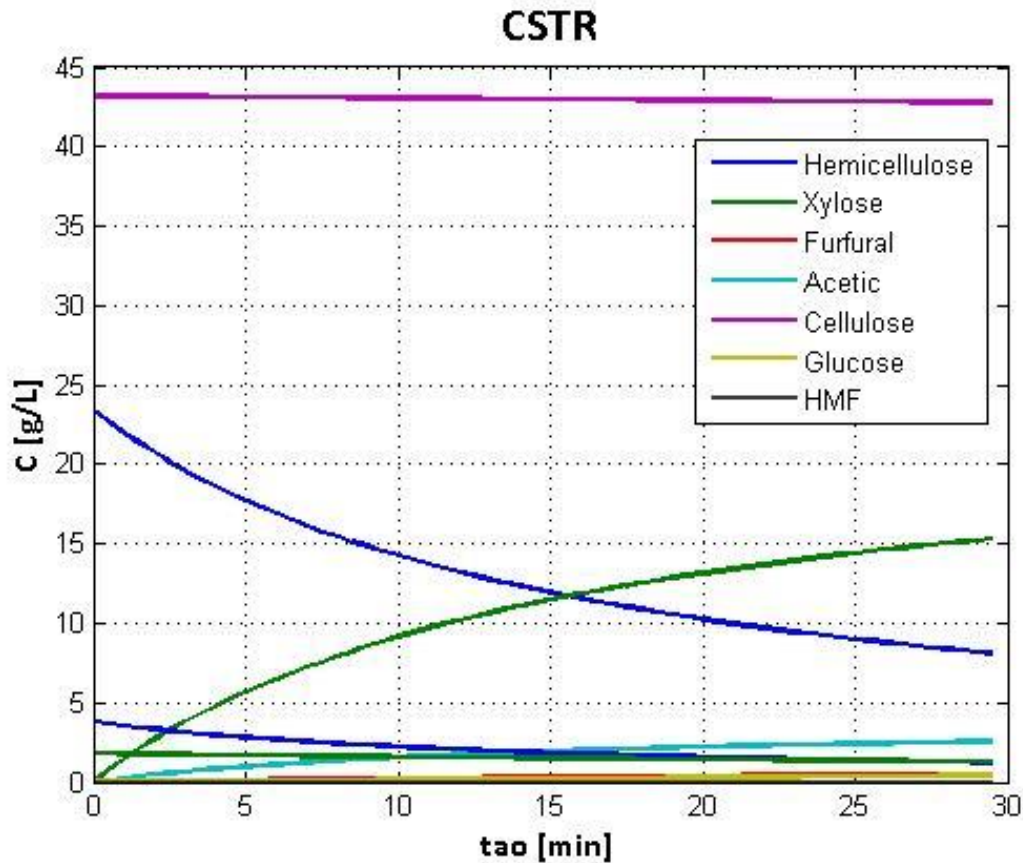




# Acid Pretreatment Model

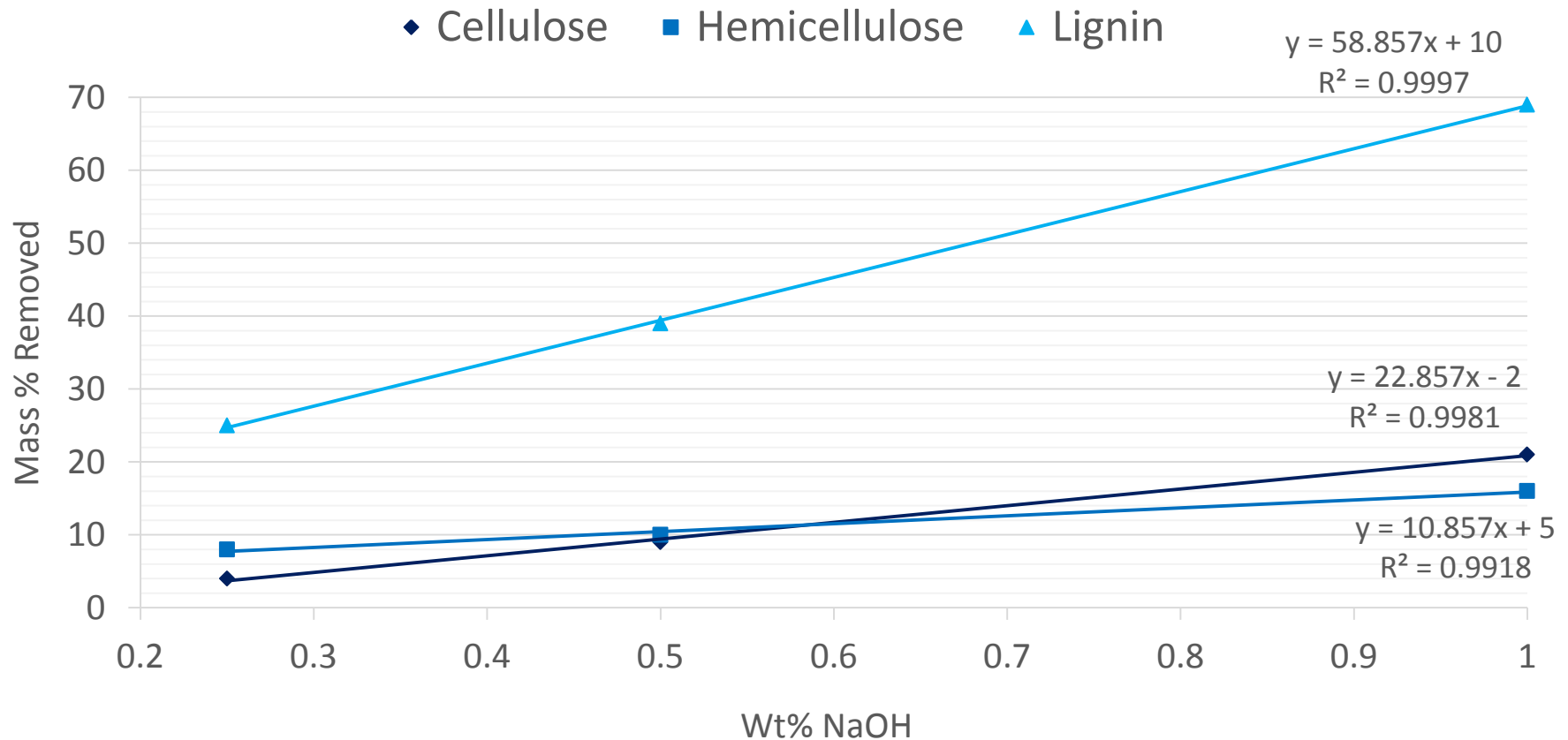
*Kinetic study of the acid hydrolysis of sugar cane bagasse.*

Aguilar, R., Ramirez, J., Garrote, G., & Vazquez, M.



# Delignification Model

*Chemical & morphological characterization of sugarcane bagasse submitted to a delignification process for enhanced enzymatic digestibility.*



# Acid Hydrolysis Model

*Dilute acid hydrolysis of sugar cane bagasse at high temperatures: A kinetic study of cellulose saccharification and glucose decomposition. Part I: sulfuric acid as the catalyst.*

Gurgel, L. & Marabezi, K.

- Kinetic equations for cellulose reactions with Arrhenius temperature relationship.
- Conversion factors for hemicellulose to xylose and xylose to furfural.
- GAMS model optimises T (between 180 & 230°C),  $\tau$ , acid percentage (0.07, 0,14 or 0.28 wt%)

# Enzymatic Hydrolysis Model

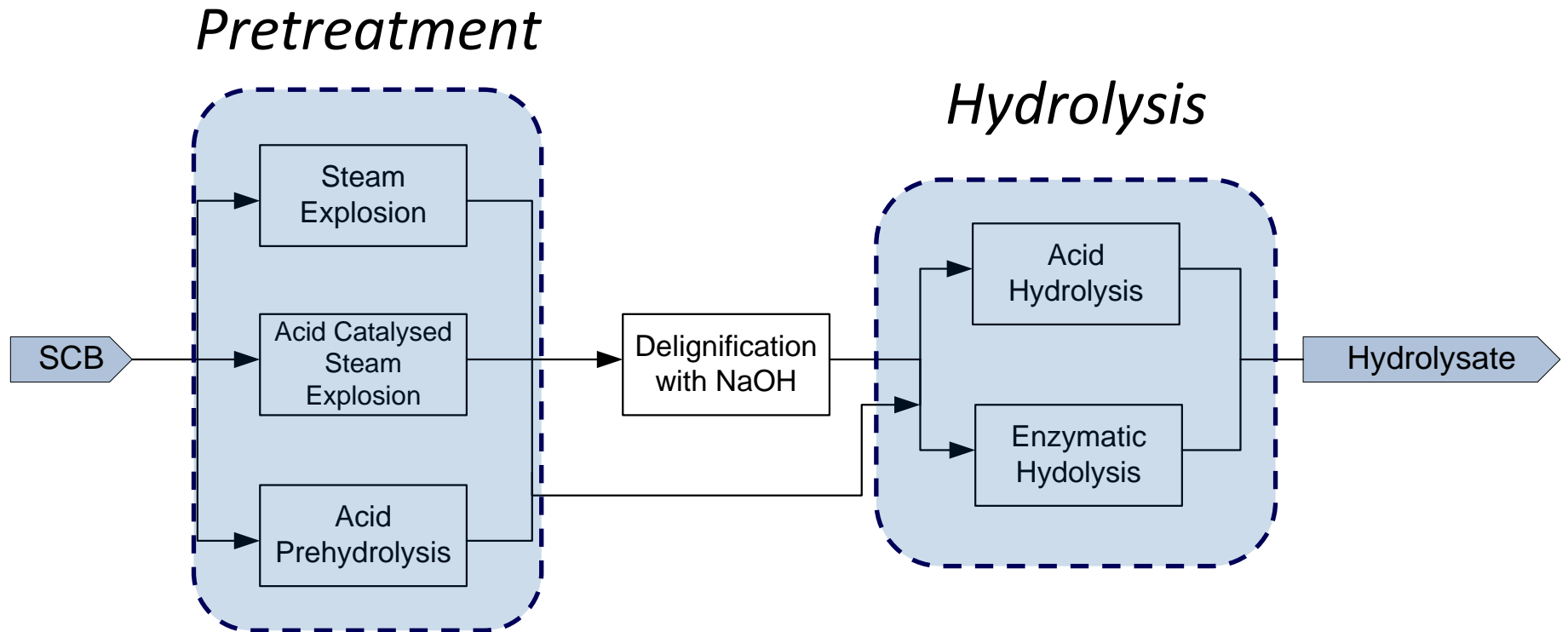
*Technological Assessment Program (PAT). The Virtual Sugarcane Biorefinery (VSB).*

Bonomi, A. et al.

- CTBE's Aspen simulation.
- Conversions for individual reactions.
- Fixed T,  $\tau$  and enzyme loading.
- Least flexible model.



# Superstructure





# Challenges

- Creating a meaningful economic objective function
- Finding good data
  - Kinetic of acids is well researched
  - Steam explosion more black box approach
  - Trade secrets around enzyme mixtures
- Combining models
  - Acid prehydrolysis & acid hydrolysis
  - Effects of pretreatment on hydrolysis
  - Effects of delignification on hydrolysis

# Limitations

- Hard to quantify physical effects
- Experiments have very specific conditions
  - Difficult to adjust experimental to new situations
  - Little flexibility in some models (eg. fixed residence time, water to solids ratio)
- Solvers very sensitive to initialisations (local optima)

# Conclusion

- Multi-objective modelling
  - Economic and environmental objectives
- Pretreatment, delignification, hydrolysis
  - Kinetics and simulations
- Combining models and incorporating delignification

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