

## Quantitative Methods for Strategic and Investment Planning in the Oil-Refining Industry



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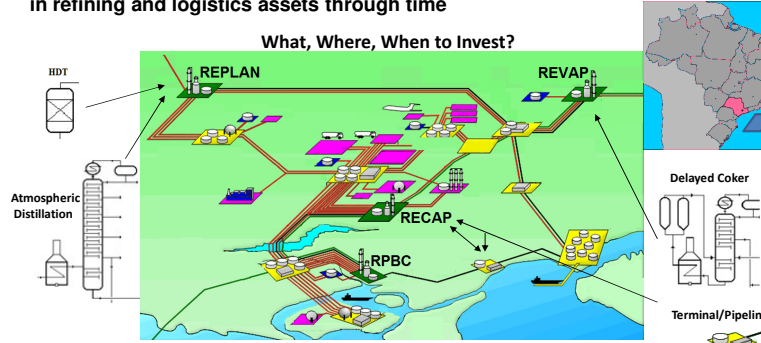


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September 4<sup>th</sup>, 2013

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### What, Where, When to Invest?



**Goal:** To develop quantitative methods to predict structural modifications in refining and logistics assets through time

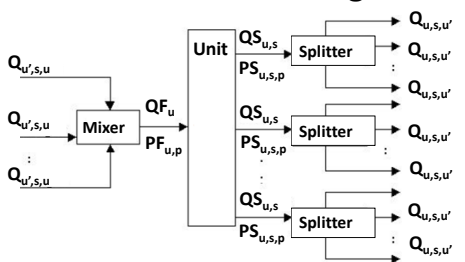
**PETROBRAS Current Tool for Strategic Planning (PLANINV) – LP**

No Production Scenario Synthesis → **PLANINV** Scenario Opt (MILP) + NLP [Processing Blending]

Only optimize streams transfers (oil and fuels import/export, market supply) → Quantitative Methods

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## Refining Modeling



**Mixer:**  
 $QF_u = \sum Q_{u',s,u}$

**Feed Properties:**  
 $PF_{u,p} = f(Q_{u',s,u}, PF_{u',s,p})$

**Unit Products:**  
 $QS_{u,s} = f(QF_u, PF_{u,p}, V_{u,v})$

**Unit Products Properties:**  
 $PS_{u,s} = f(PF_u, V_{u,v})$

**Splitter:**  
 $QS_u = \sum Q_{u,s,u'}$

(Moro, Zanin & Pinto, 1998)

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## Mixed-Integer (MILP) + Nonlinear (NLP) Models

$ye(R,U,N,T)$  = expansion of an existent unit  
 $yi(R,U,N,T)$  = installation of a new unit

$ye_{r,u,n,t} QE_u^L \leq QE_{r,u,n,t} \leq ye_{r,u,n,t} QE_u^U$   
 $yi_{r,u,n,t} QI_u^L \leq QI_{r,u,n,t} \leq yi_{r,u,n,t} QI_u^U$

$QC_{r,u,n,t} = EXCAP_{r,u,n} + QC_{r,u,n,t-1} + QE_{r,u,n,t-1}$   
 $QC_{r,u,n,t} = QC_{r,u,n,t-1} + QI_{r,u,n,t-1}$

$QC_{r,u,n,t} + QE_{r,u,n,t} \leq QF_{r,u,n,t+1}$   
 $QC_{r,u,n,t} + QI_{r,u,n,t} \leq QF_{r,u,n,t+1}$   
 $QE_{r,u,n,t} \leq QC_{r,u,n,t} \quad (u,n)_{exp} \wedge (u,n)_{ins}$

$QF(R,U,N,T)$  = operational flow  
 $QC(R,U,N,T)$  = total capacity  
 $QE(R,U,N,T)$  = expansion capacity  
 $QI(R,U,N,T)$  = installation capacity

expansion installation:  $QC = QC_{t-1} + Q_{NEW}$  MILP

expansion installation both:  $QF \leq QC$  NLP

T1      T2      T3      T

↓      ↓      ↓      ↓

Take an investment decision (binary)      Count on the additional production

**(R,U,N,T)**  
R=Refinery  
U=Unit type  
N=Number of an unit type  
T=Time

Project execution       $NPV = \sum_T (\text{sales} - \text{crude} - \text{op. costs}) - \sum_T \text{invest. costs}$

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### Capital Cost Constraint

$$\sum_R \sum_U \sum_N \left( \alpha_{u,t}^E Q E_{r,u,n,t} + \beta_{u,t}^E y e_{r,u,n,t} \right) \leq CI(t) \quad \forall t \quad \text{capital for investment p/ time}$$

### Logic Constraints for Expansions and Installations

$$\sum_N (y e_{r,u,n,t} + y i_{r,u,n,t}) \leq 1 \quad \forall r, u, t \quad \text{only one expansion or installation p/ type p/ time}$$

$$\sum_T y e_{r,u,n,t} \leq 1 \quad \forall r, u, n \quad \text{expansion can appear only once during all time}$$

$$\sum_T y i_{r,u,n,t} \leq 1 \quad \forall r, u, n \quad \text{installation can appear only once during all time}$$

$$\sum_{U_G} \sum_N (y e_{r,u,n,t} + y i_{r,u,n,t}) \leq 1 \quad \forall r, t \quad \text{only one expansion or installation p/ group p/ time}$$

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### Logic Constraints for Unit Type Investments

$$\begin{bmatrix} y_{VDCU} \\ \uparrow GO + VR \\ GOC \\ VRC \end{bmatrix} \vee \begin{bmatrix} y_{CDU} \\ -y_{VDCU} \\ \uparrow ATR \\ ATRC, 10\% \text{ in FCC, DC} \end{bmatrix} \vee \begin{bmatrix} -y_{CDU} \\ VRC \end{bmatrix}$$

**Unit Groups (U<sub>g</sub>):**  
 ATRC = Atmospheric Residue Cracking  
 GOC = Gasoil Cracking  
 VRC = Vacuum Residue Cracking  
 ON= Octane Number Booster

**1<sup>st</sup> Level:**  $y_{CDU} \vee y_{VRC}$

$$\sum_N (y e_{r,CDU,n,t} + y i_{r,CDU,n,t}) + \sum_{U_{VRC}} \sum_N (y e_{r,u,n,t} + y i_{r,un,t}) \leq 1 \quad \forall r, t$$

**2<sup>nd</sup> Level:**  $y_{CDU} \Rightarrow y_{VDCU} \vee y_{ATRC}$

$$\sum_N (y e_{r,VDCU,n,t} + y i_{r,VDCU,n,t}) + \sum_{U_{ATRC}} \sum_N (y e_{r,u,n,t} + y i_{r,un,t}) \leq \sum_N [(y e_{r,CDU,n,t} + y i_{r,CDU,n,t})]$$

$$y_{VDCU} \Rightarrow y_{GOC} \wedge y_{VRC}$$

$$\sum_{U_{GOC}} \sum_N (y e_{r,u,n,t} + y i_{r,un,t}) \leq \sum_N [(y e_{r,VDCU,n,t} + y i_{r,VDCU,n,t})] \quad \forall r, t$$

$$\sum_{U_{VRC}} \sum_N (y e_{r,u,n,t} + y i_{r,un,t}) \leq \sum_N [(y e_{r,VDCU,n,t} + y i_{r,VDCU,n,t})] \quad \forall r, t$$

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### Crude Diet and Processing Equations

**Crude diet**

$$Q_{FCDU} = \sum Q_{CRUDE,CDU}$$

$$PF_{CRUDE,p} = f(Q_{CRUDE,CDU}, PF_{CRUDE,CDU})$$

**Improved Swing-Cut** (Menezes, Kelly & Grossmann, 2013)

$$Q_{S_{CDU,s}} = \sum Q_{C_{ASW,s}}$$

$$PF_{S,p} = f(Q_{C_{ASW,s}}, PF_{C_{ASW,p}})$$

**Other models** (Moro, Zanin & Pinto, 1998)

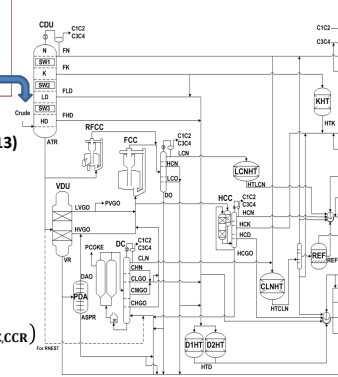
$$Q_{S_{FCC,s}} = Q_{F_{FCC}} \bar{Y}_{FCC,s} + \Delta Y_{FCC,s,CCR} \cdot (PF_{FCC,CCR} - PF_{FCC,CCR}) + \Delta Y_{FCC,s,RXT} \cdot RXT_{FCC} + \Delta Y_{FCC,s,CFT} \cdot CFT_{FCC}$$

$$Q_{S_{PDA,ASFR}} = Q_{F_{PDA}} (1 - EXT_{PDA})$$

$$PS_{HT,s} = PF_{HT} (1 - SEV_{HT})$$

**Bilinear Terms**

**Crude Assay:**  
 Yields  
 Gravity  
 Acidity



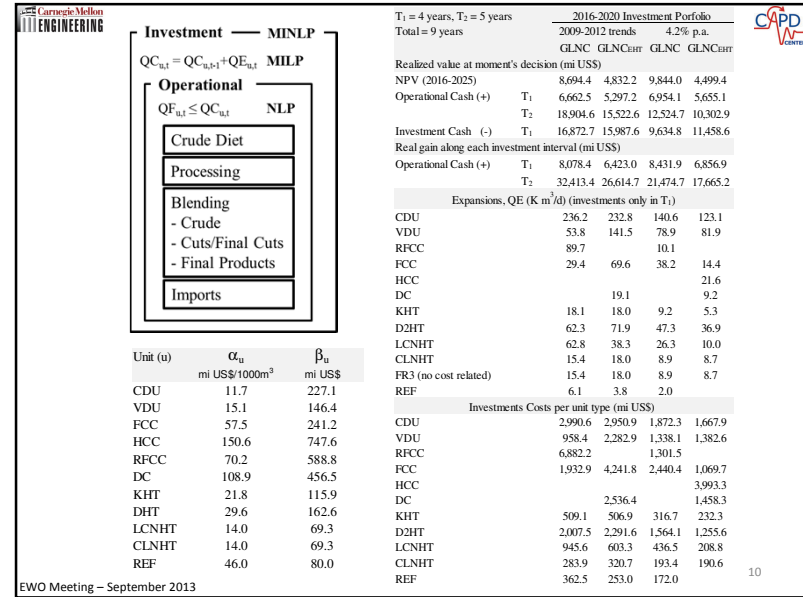
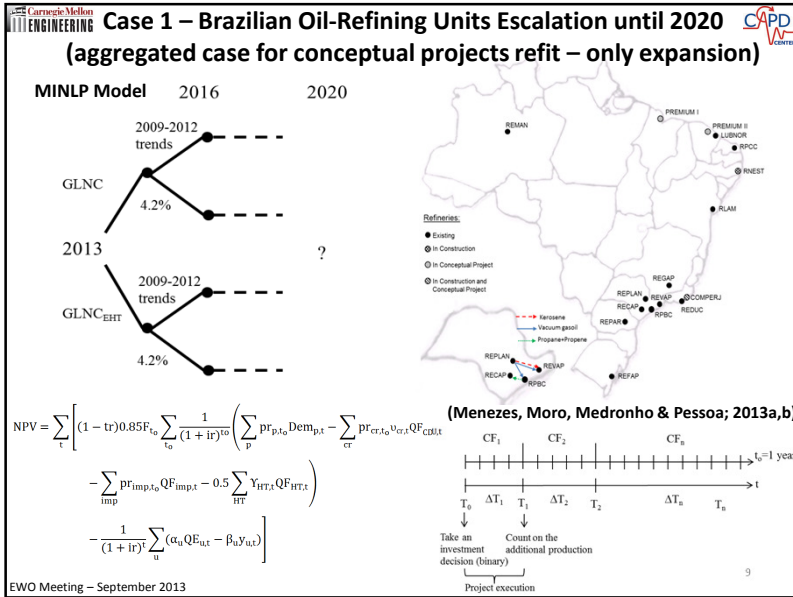
CDU: Crude distillation Unit  
 FCC: Fluid Catalytic Cracking  
 PDA: Propane Desasphalting  
 HT: Hydrotreater

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### Blending Equations

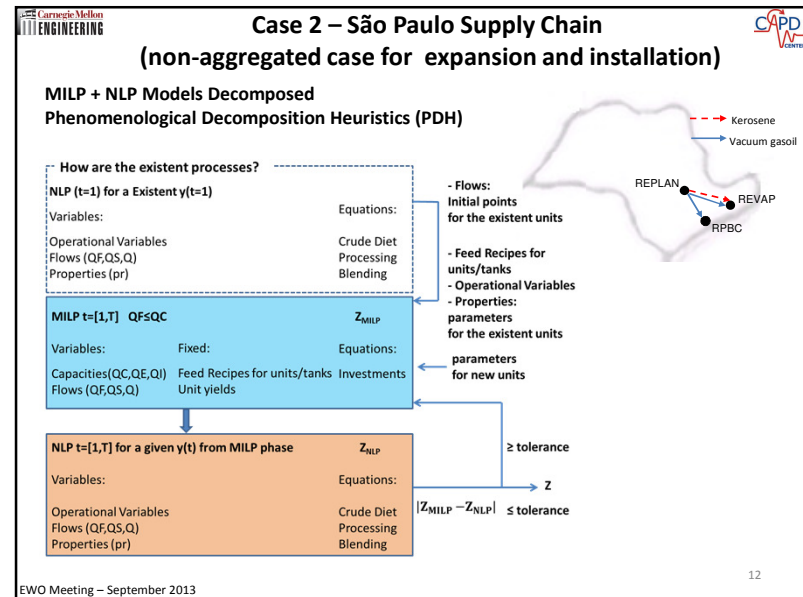
Property Group	PF or P	base	Property Name	PF or IPF (Property Index)
Concentration	ACID	Mass	Acidity	$PF_{Vol} = \frac{\sum P \cdot Vol}{\sum Vol}$
	GRAV	Vol	Gravity	
	SULF	Mass	Sulfur Content	$PF_{Mass} = \frac{\sum P \cdot GRAV \cdot Vol}{\sum GRAV \cdot Vol}$
	CCR	Mass	Conradson Carbon Residue	
Volatility	DIST	Vol	Distillation	$IP_{RVP} = \left( \frac{1.8P + 32}{549} \right)^{7.8}$ $IP_{FLASH} = e^{\left( \frac{10006.1}{1.8P + 415} - 14.09 \right)}$
	RVP	Vol (IP)	Reid Vapor Pressure	
	FLASH	Vol (IP)	Flash Point	
Combustion	MON	Formula	Motor Octane Number	$PF_{MON} = \sum_i MONB_i \cdot Vol_i$
	RON	Formula	Research Octane Number	
	CETAN	Vol	Cetane Number	
Stability	GUM	Vol	Gum	$IP_{VISC} = \frac{\log_{10} P}{\log_{10} 1000P}$
	VISC	Vol (IP)	Viscosity	
Fluidity	POUR	Vol (IP)	Pour Point	$IPF = \frac{\sum IP \cdot Vol}{\sum Vol}$ $PF = f^{-1}(IPF)$
	CLOUD	Vol (IP)	Cloud Point	
	PPFC	Vol (IP)	Plug-Flow Filter	

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Profit [=] mi US\$/day Margin [=] US\$/barrel	2020 results								
	2009-2012 trends				4.2% p.a.				
	GLNC	GLNCEHT	GLNC	GLNCEHT	GLNC	GLNCEHT	GLNC	GLNCEHT	
Realized value at moment's decision	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	
Profit	4,563	10,359	3,628	8,506	4,763	6,763	3,873	5,645	
Margin	1.90	2.62	1.51	2.17	1.99	2.07	1.61	1.76	
Real value along each investment interval	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	
Profit	5,533	17,761	4,399	14,583	5,775	11,767	4,697	9,680	
Margin	2.31	4.50	1.83	3.72	2.41	3.54	1.96	3.02	
Real value at the investment interval beginning	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	T <sub>1</sub>	T <sub>2</sub>	
Profit	4,983	15,663	3,961	12,860	5,201	10,375	4,229	8,534	
Margin	2.16	4.14	1.72	3.41	2.26	3.26	1.84	2.77	
Equations	1,117								
Discrete Variables	24								
Continuous Variables	1,171								
Non zero elements	3,876								
Non linear elements	1,944								
Iterations	2,265	2,323	2,148	2,303					
CPU (s)	2.81	2.48	2.57	2.50					
Capacity [=] K m <sup>3</sup> /d	2020 (Results)								
	2009-2012 trends				4.2% p.a. (Conceptual Project)				
Unit (u)	2016	GLNC	GLNCEHT	GLNC	GLNCEHT	GLNC	GLNCEHT	GLNC	GLNCEHT
CDU	366	602	599	507	489	536			
VDU	155	209	296	234	237	260			
RFCC	20	110	20	30	20	20			
FCC	72	101	142	110	86	72			
HCC	10	10	10	10	32	73			
DC	70	70	89	70	79	124			
KHT	15	33	33	24	20	15			
D2HT	65	127	137	112	102	135			
LCNHT	50	113	88	76	60	50			
CLNHT	30	45	48	39	39	60			
FRAC3	30	45	48	39	39	60			
REF	10	16	14	12	10	10			
Capital Needed (mi US\$)		16,872.7	15,987.6	9,634.8	11,458.6	23,301.9			

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REPLAN	U.N.T	REVAP	U.N.T	RPBC	U.N.T	(19 exp / 3 inst)
CDU.(1,2)	CDU.2.2	CDU.1	CDU.2.1	CDU.(1,2,3)	VDU.1.1	(R,U,N,T) R.U.(N).T Refinery Unit Type Number of the Unit type Time
VDU.(1,2)	VDU.1.2	VDU.1	VDU.1.1	VDU.(1,2)	FCC.1.1	
FCC.(1,2)	FCC.1.1	FCC.1	FCC.1.1	FCC.1		
DC.(1,2)	DHT.2.1	PDA.1		DC.(1,2)	LCNHT.1.1	
LCNHT.(1,2)	LCNHT.1.1	DC.1		LCNHT.(1,2)	LCNHT.1.1	
CLNHT.(1,2)	CLNHT.1.1	LCNHT.1	LCNHT.1.1	CLNHT.1	DHT.1.1	
DHT.(1,2)		CLNHT.1	CLNHT.1.1	DHT.(1,2)		
REF.1	CDU.3.1	KHT.(1,2)	KHT.1.1	REF.1		
	VDU.3.1	DHT.(1,2)	KHT.2.1	ALK.1		
		REF.1	DHT.2.1			
			CDU.3.2			

15 units	6 expans 2 install	12 units	8 expans 1 install	15 units	5 expans
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						MILP			
	step	1	2	3	4	Discrete Var.	Eq.	Var.	Non-zero
CPU (s)	MILP	0.28	0.23	0.17	0.12	444	5,960	7,620	28,693
	NLP	infeas	infeas	infeas	115.9				
NPV (bi U\$)	MILP	31.16	31.16	31.16	31.16				
	NLP	infeas	infeas	infeas	31.39	Eq.	Var.	Non-zero	Non-Linear
						7,223	10,751	70,376	45,446

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## Next Steps

**Structural and temporal decomposition strategies integrated with the phenomenological decomposition heuristics (PDH)**

**Deal with operational modes to include investments in logistics**

**Uncertainties?**

- Marketing & Sales (demands)
- Purchasing & Procurement
- Fuels Prices Brazil x World
- Projects delays  $(EXCAP + Q_{new,t-1}) / QC_t$

Slope (project velocity)  
 $\alpha < 1$  anticipation  
 $\alpha = 1$   
 $\alpha > 1$  delay