



Role of Process Systems Engineering in Chemical Engineering

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*Chemical Engineering Division's Lectureship Award
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June 15, 2015*



ASEE's 122nd Annual
Conference & Exposition
Washington Convention Center
Seattle, WA
June 14 - 17, 2015
Making Value for Society

Major Questions

What are major trends in Chemical Engineering?

- *Brief historical evolution*
- *Recent trends and academic/industry disconnect*

What is the impact of Process Systems Engineering in Chemical Eng. and major research challenges?

- *Process and Product Design*
- *Energy and sustainability*
- *Enterprise-wide Optimization*



History of Chemical Engineering



George Davis, Manchester 1888



Lewis Norton, MIT 1888

Unit Operations



Arthur D. Little, MIT, 1916

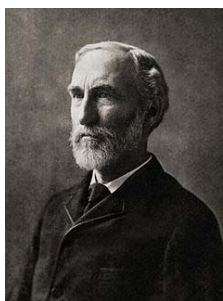


William Walker, MIT 1924



Olaf Hougen, Wisconsin 1947

Thermodynamics



J.W. Gibbs, 1878



H. Helmholtz, 1847



L. Boltzmann, 1866



**K.G. Denbigh, Southampton,
London, Imperial, 1955**



Transport Phenomena

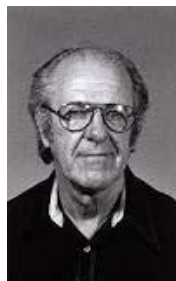


Bird, Stewart, Lightfoot, Wisconsin, 1960

Applied Mathematics/Reaction Engineering



R. Aris, 1962; N. Amundson, 1972; Minnesota

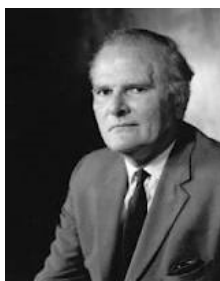


Fluid Mechanics



G. Batchelor, Cambridge, 1967

Mass Transfer



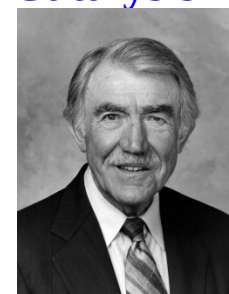
P.V. Danckwerts, Cambridge 1965

Polymers



P. Flory, 1969; Dupont, Cornell, Carnegie Mellon

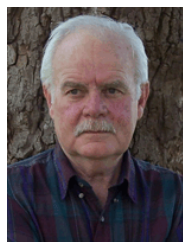
Catalysis



Michel Boudard, Stanford 1968



Process Systems Engineering



Dale Rudd, Wisconsin 1968 Roger Sargent, Imperial College 1964

Bioengineering



Robert Langer, MIT 1977 Jay Bailey, Caltech 1986 Michael Shuler, Cornell, 1984

Nanotechnology



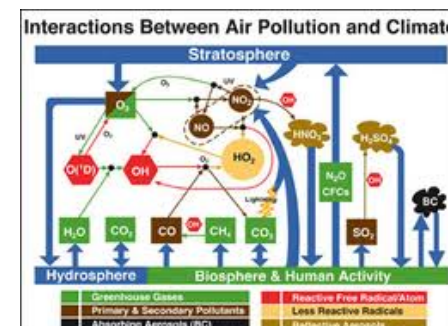
CarnegieMellon

Richard Feynman, Caltech 1968 George Whitesides, Harvard 1968

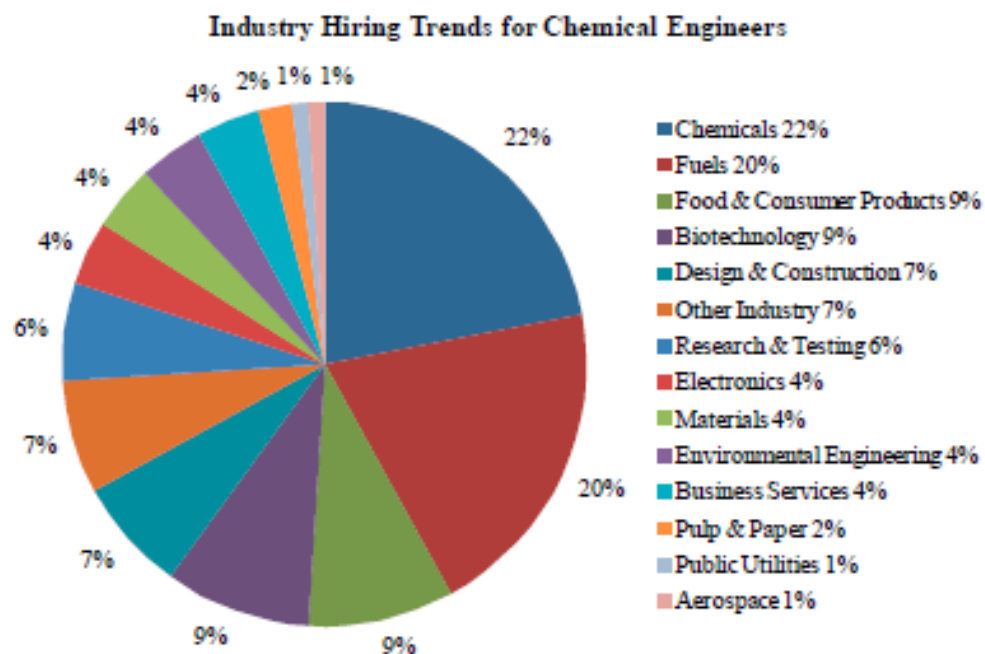
Diversification Chemical Engineering



Chemical Engineers work in a variety of manufacturing operations including oil refineries like this one.



B.S. Job placement (AIChE, 2007)



**Chemicals
Fuels ~42%**



Trends in Chemical Engineering (Last decade)



■ Bioengineering area :

- Has been **“hot” area**: most new faculty in bio area

New frontier in chemical engineering:

Bob Langer MIT: Study and development of polymers to deliver drugs, particularly genetically engineered proteins, DNA and RNAi, continuously at controlled rates for prolonged periods of time

- Many new **Biomedical Engineering Depts** (Whittaker Foundation)

Job market biomedical engineers?

■ Many U.S. departments (~50%) were renamed as:

Chemical and Biomolecular Engineering

(e.g. Cornell, U. Penn., Illinois, Georgia Tech)

Chemical and Biological Engineering

(e.g. Colorado, Northwestern, Notre Dame, Wisconsin)



Trends in Chemical Engineering (Last decade)

- Nanotechnology is other “hot” area
- Increasing emphasis on Science in Chemical Eng. Departments
 - Many professors are not chemical engineers
 - Has increased **multidisciplinary approach**
 - **Decreased emphasis on chemical engineering fundamentals** (fewer transport courses, one semester Thermo: 1st&2nd Law, Phase & Chemical Equilibria)
 - **Process Design courses largely outsourced to retired industry people**
 - **Process Control no longer required at several U.S. universities**

Many faculty members in US *do not publish anymore* in chemical engineering journals

Move from Engineering to Science



25% US



15% US



Impact factors ~ 2.2



Impact factors ~ 30

The Industry Connection

Revenues of major U.S. companies (billions)

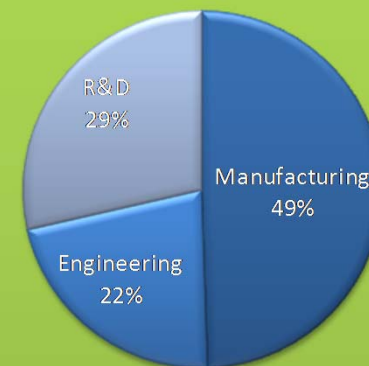
	(2006)	(2012)
ExxonMobil	\$365.5	\$452.93
ChevronTexaco	204.9	241.9
Dow	49.1	56.8
DuPont	27.4	38.72
Procter & Gamble	68.2	82.55
Johnson & Johnson	53.3	67.22
Merck	22.3	48.05
Bristol-Myers Squibb	17.9	21.24
Amgen	13.8	23.6
Genentech	7.6	17.3

One trillion dollar industry !!

Industrial Survey on Importance of Skills

John Chen (2013)

Skill	Average Relative Importance 1-5
UO: unit operations, transport phenomena, thermodynamics, separation processes *	4.6
RE: reaction engineering, catalysis, kinetics.	4.0
AM: analysis, modeling, simulation, process control *	4.0
MAT: materials, surface science, polymers *	3.2
BIO: biotechnology, medical and life sciences	2.1
NANO: nanotechnology and its applications	1.8



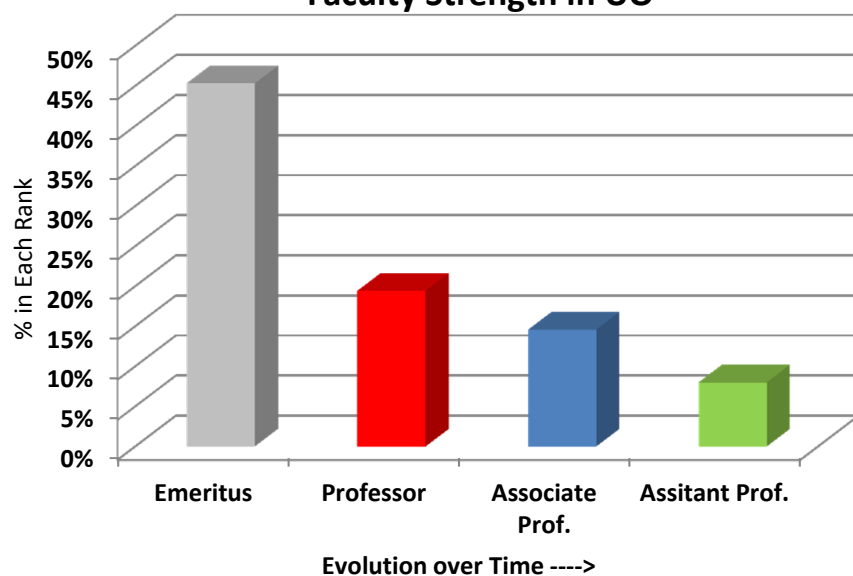
*93 respondents
(ChemE recruiters
and leaders)*

** main perceived gaps between importance and proficiency by new hires*

Academic Disconnect: Trends Faculty Composition

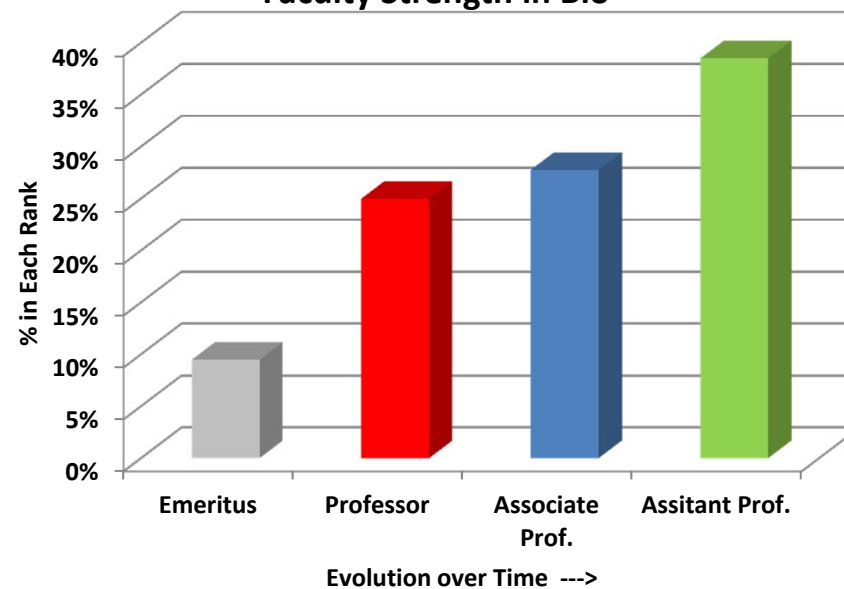
Unit Operations

Faculty Strength in UO



Bioengineering

Faculty Strength in Bio





Dow Decides to Influence the Scientific Funding Environment

AS THE BIGGEST US EMPLOYER IN THE CHEMICAL INDUSTRY DOW HAS TO:

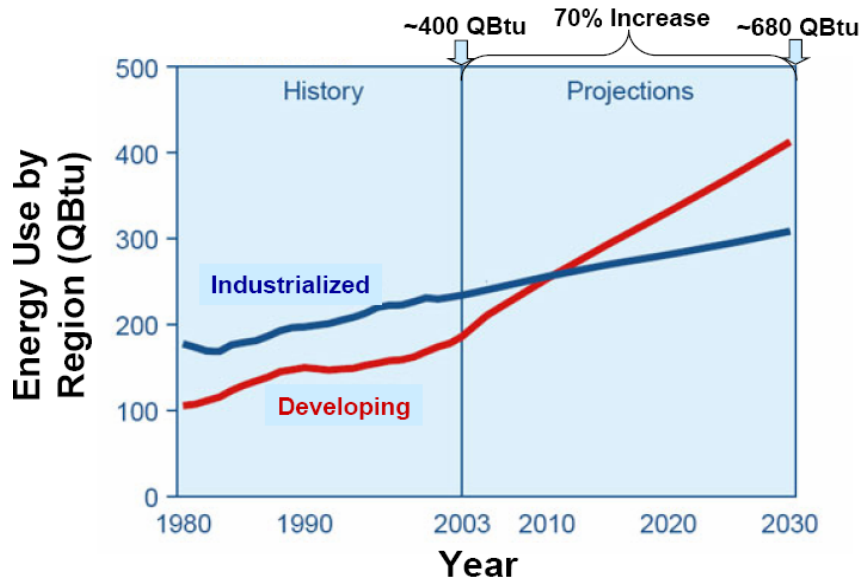
- Partner with strategic universities to:
 - Work on problems relevant to Dow
 - Develop talent with the skills needed
 - Influence the “Influencers”

Commit to Long Term Funding
\$25 million/year for next 10 yr in US
\$10 million/year for next 10 yr outside US

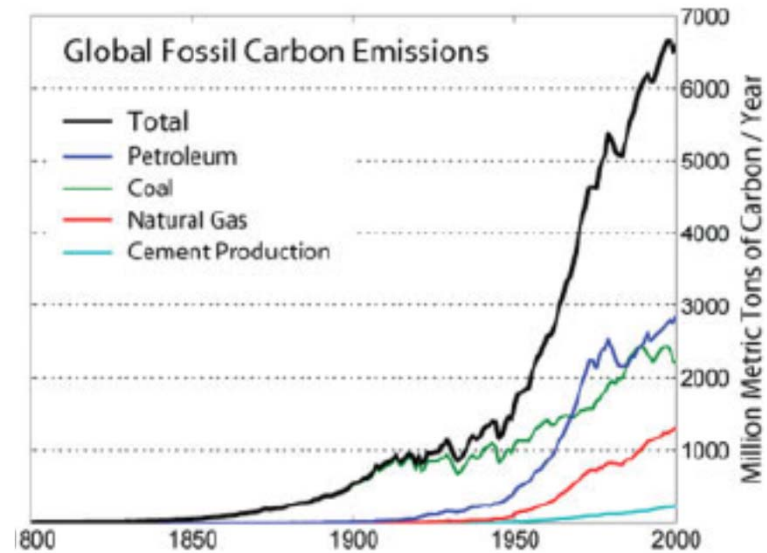


New emphasis: energy and sustainability

Growing World Energy Demand Most Energy Growth in Developing Nations



DOE EIA, International Energy Outlook 2006, Figure 8



Sheppard, Socolow (2007)

Energy and sustainability likely to swing pendulum away from bio and nano areas in Chemical Engineering



Process Systems Engineering is concerned with the systematic analysis and optimization of decision making processes for the discovery, design, manufacture and distribution of chemical products.

What is science base for PSE?

Process Knowledge => Conceptual design=> Process Integration

Numerical analysis => Simulation=> Performance process-product

Mathematical Programming => Optimization => Synthesis/design

Systems and Control Theory => Process Control => Manufacture

**Computer Science => Advanced Info./Computing => Efficient
problem solving**

Management Science => Operations/Business => Supply chain

Mathematical Programming

MINLP: *Mixed-integer nonlinear programming*

$$\min Z = f(x, y)$$

$$\text{s.t.} \quad h(x, y) = 0$$

$$g(x, y) \leq 0$$

$$x \in R^n, \quad y \in \{0,1\}^m$$

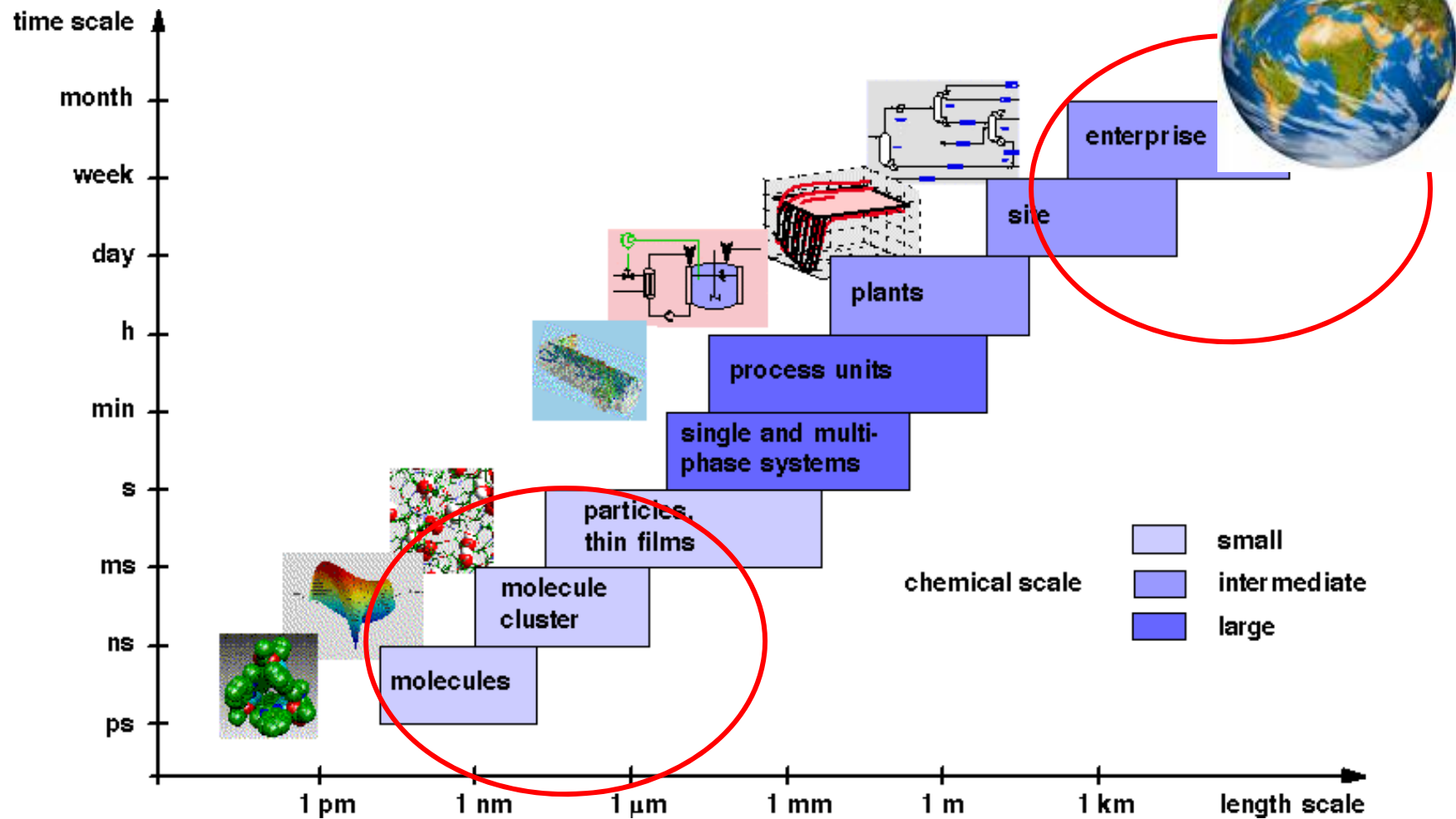
MILP: f, h, g linear

LP: f, h, g linear, only x

NLP: f, h, g nonlinear, only x

Process Systems Engineering Expanded its Scope

(Grossmann & Westerberg, 2000; Marquardt et al, 1998)





Research Challenges in PSE



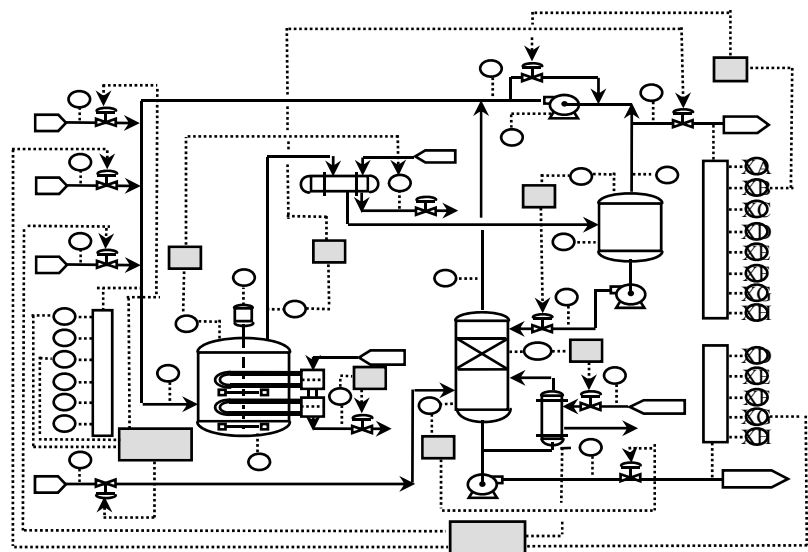
I. Product and Process Design

II. Energy and Sustainability

III. Enterprise-wide Optimization

I. Product and Process Design: from “Bulk” to “Molecular” Processing

George Stephanopoulos (2004)

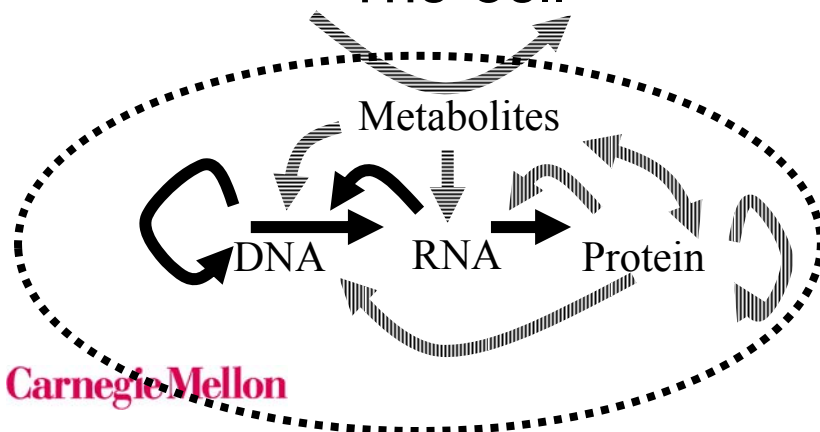


Macro-Processing:
Batch or Continuous Chemical Plants

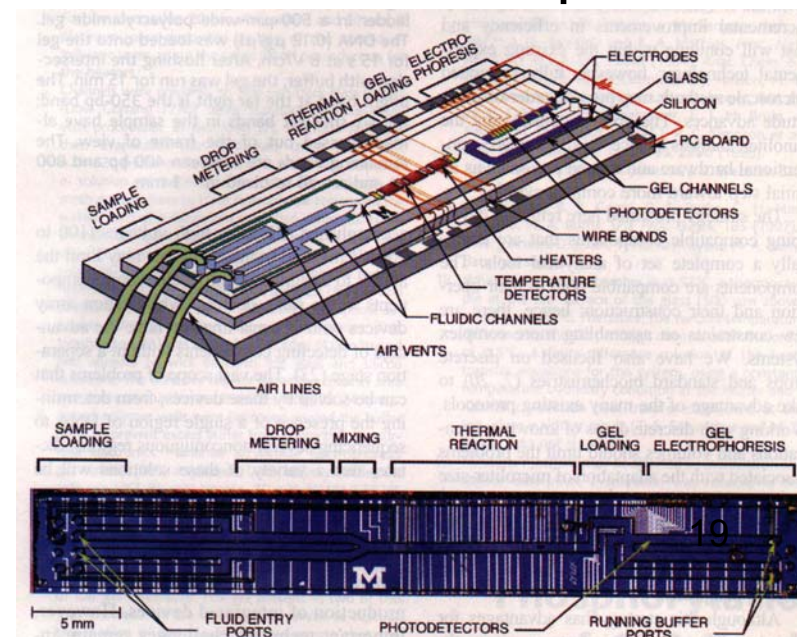


Micro-Processing:
Plant-on-a-Chip

Molecular-Processing:
The Cell



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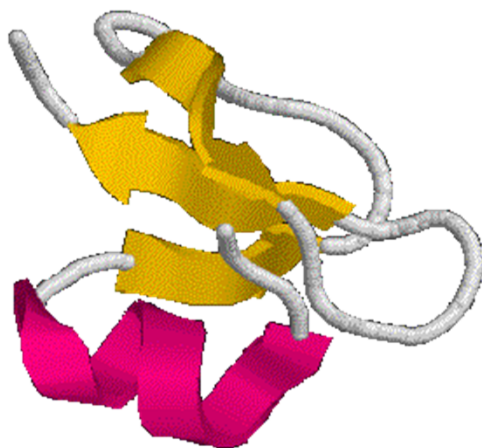


De Novo Protein Design (Chris Floudas, Princeton)



Define target template

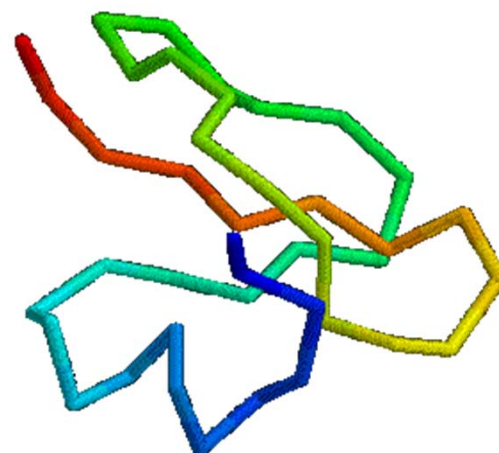
Backbone coordinates for N,Ca,C,O
and possibly Ca-Cb vectors from PDB



Human b-Defensin-2
hbd-2 (PDB: 1fqg)

Design folded protein

Which amino acid sequences will
stabilize this target structure ?



Full sequence design

Approach

In silico sequence selection => **MILP**

Fold specificity => **Global optimization**

Combinatorial complexity

-Backbone length : n

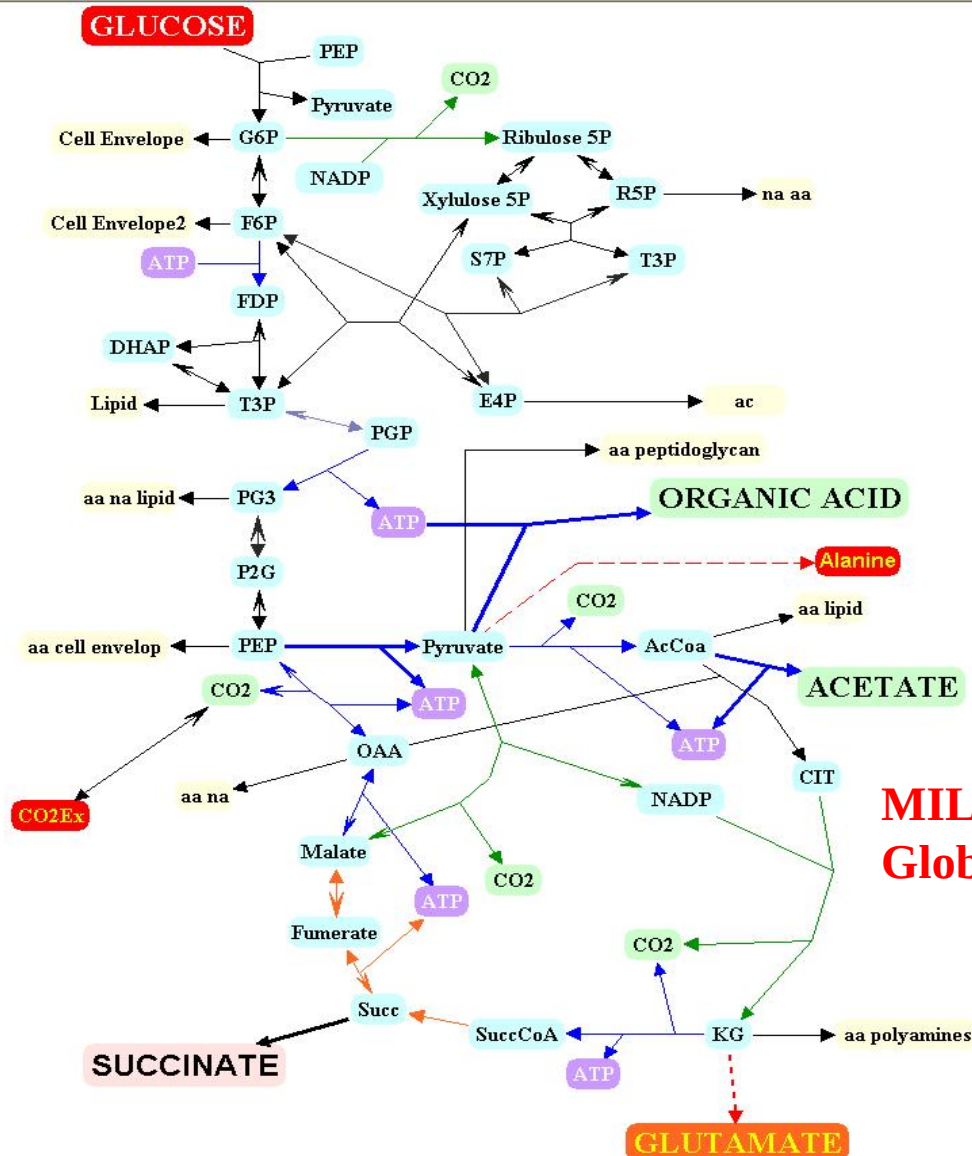
-Amino acids per position : m

m^n possible sequences

=> New improved inhibitors

(Klapeis, Floudas, Lambris, Morikis, 2004)

(Ghosh, Domach, Grossmann, 2005)

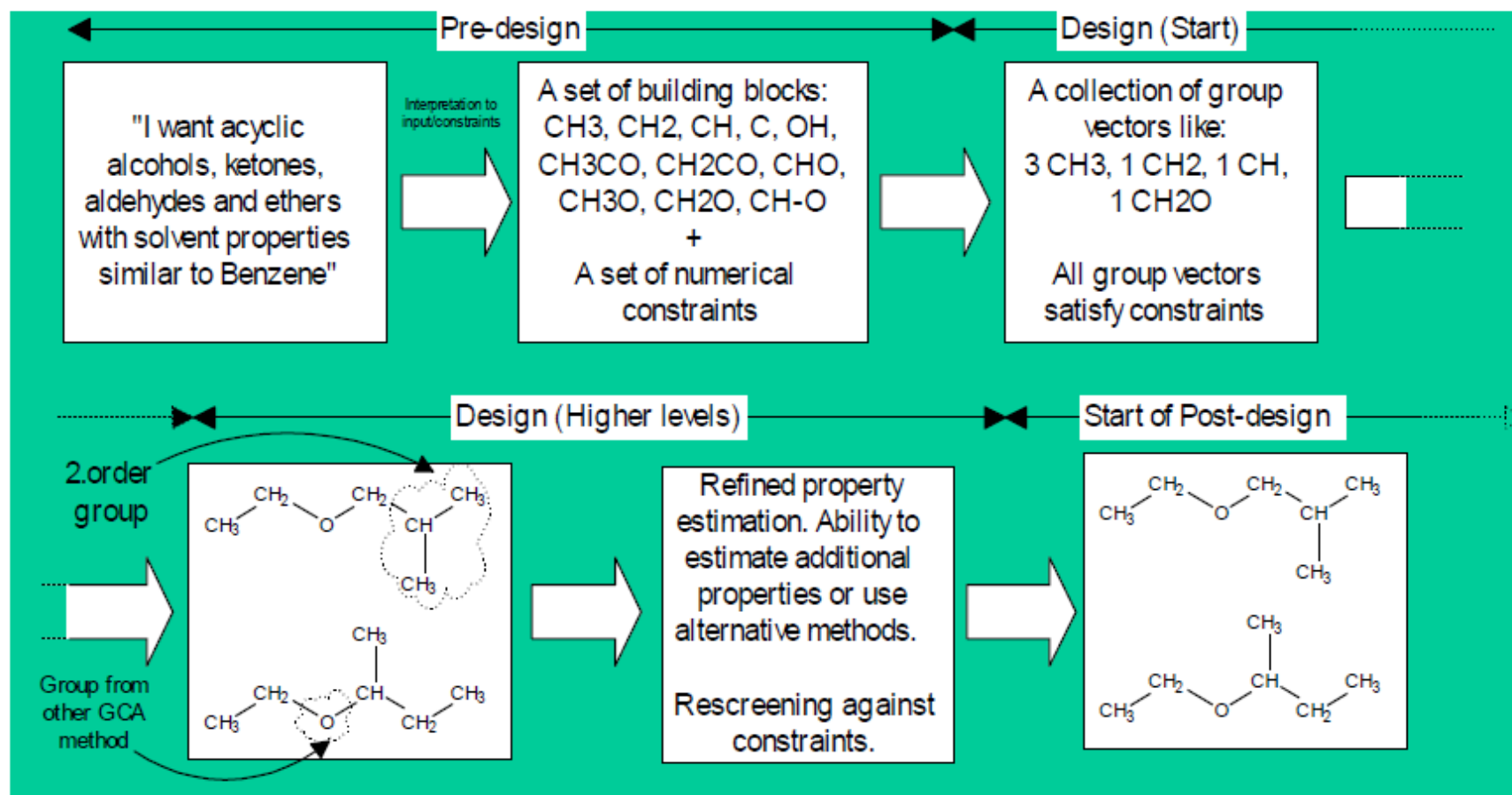


**Find reaction pathway
(linear combination of
extreme points for fluxes)
that minimizes squared
deviation from NMR spectra
for given selection of
measured metabolites**

MILP for all extreme points

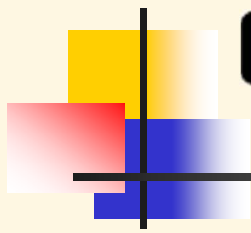
Global optimization inverse problem

Solvent selection-substitution-design problem



Method: CAMD (Computer Aided Molecular Design)

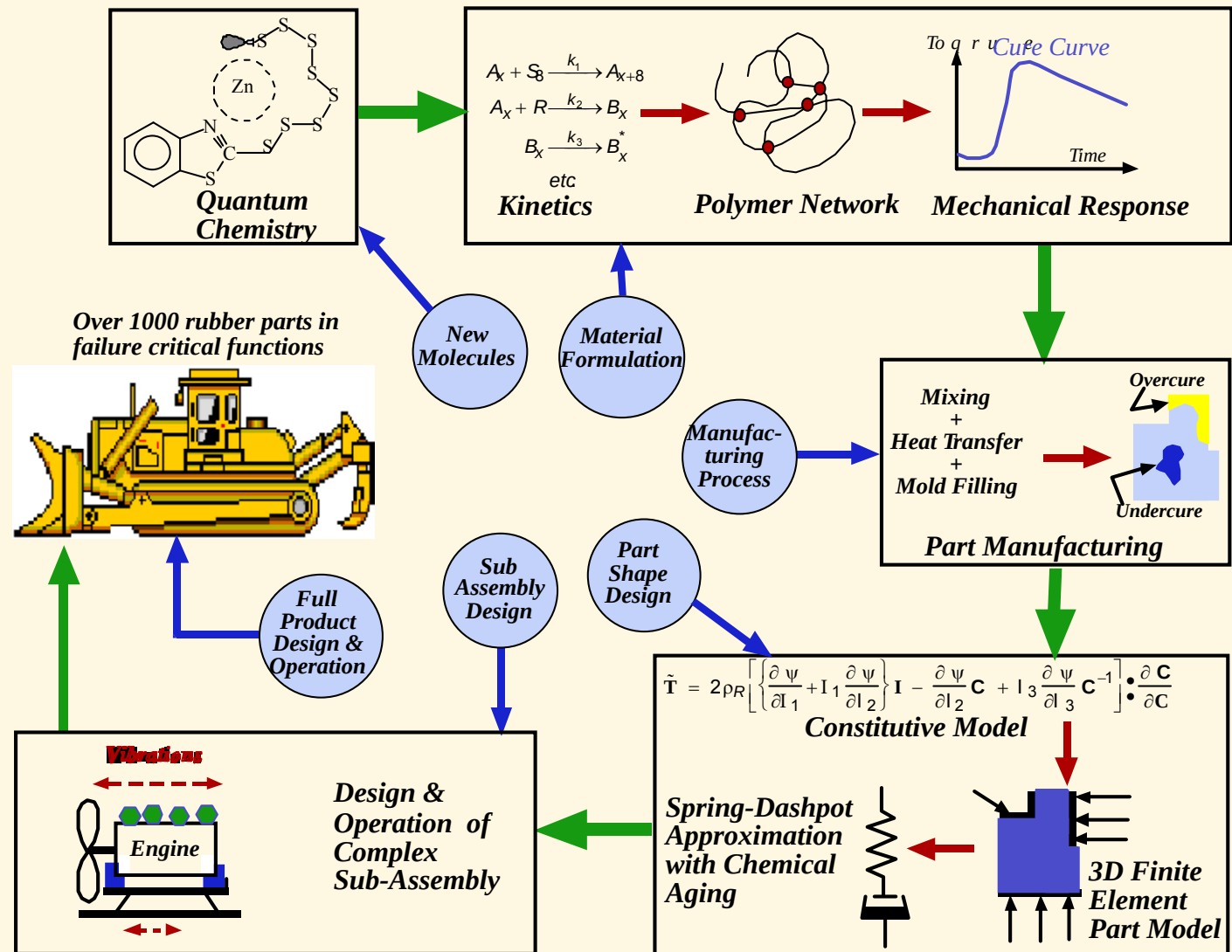
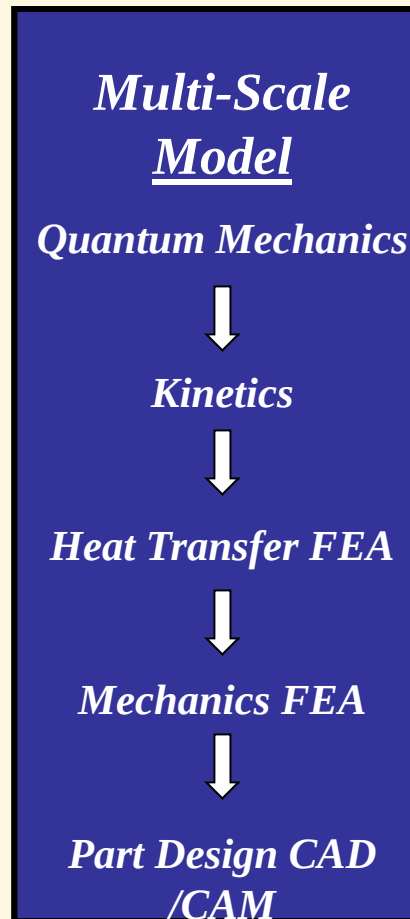
Gani et al. (2012)



CATERPILLAR®

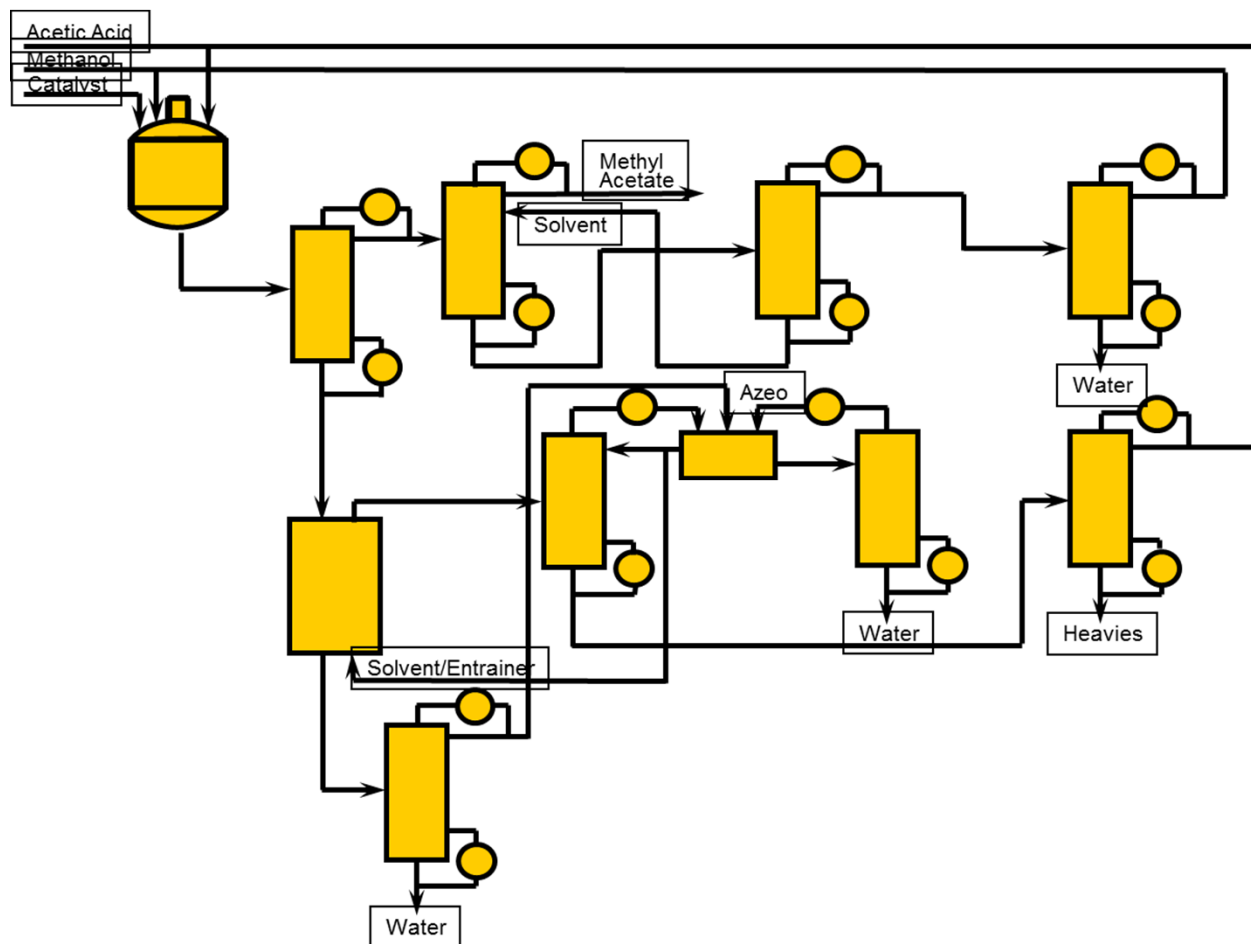
Venkat Venkatasubramanian

Integrated Design of Formulated Rubber Parts

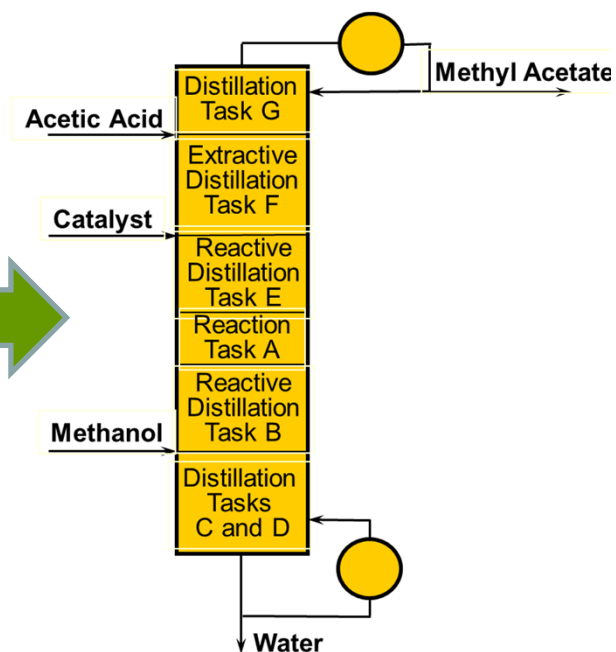


Example Process Intensification

Methyl Acetate Flowsheet



Single Reactive Dist Col!

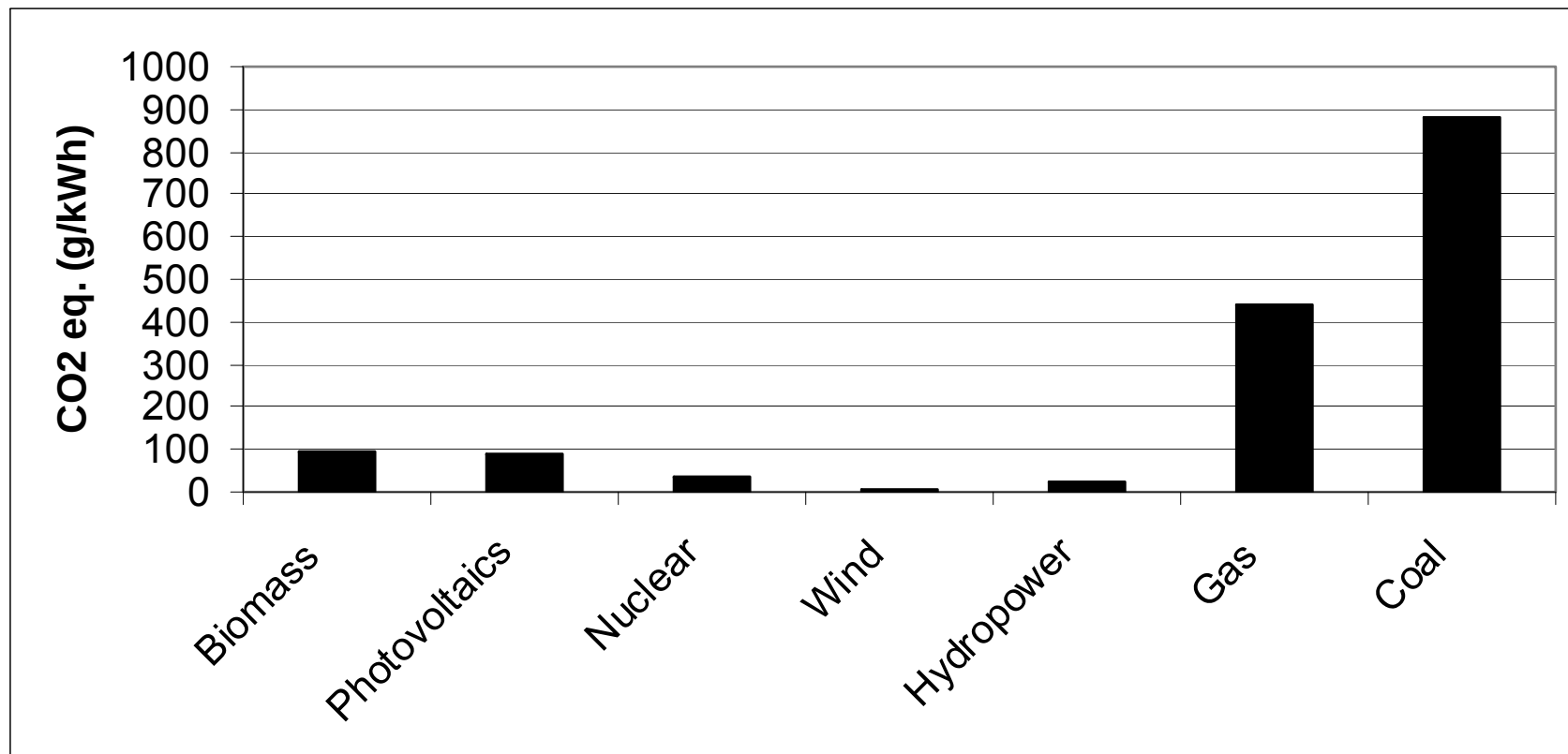


EASTMAN Sirola (1988)

II. Energy and Sustainability

Environmental impact

Renewables: Carbon footprint various Energy Options



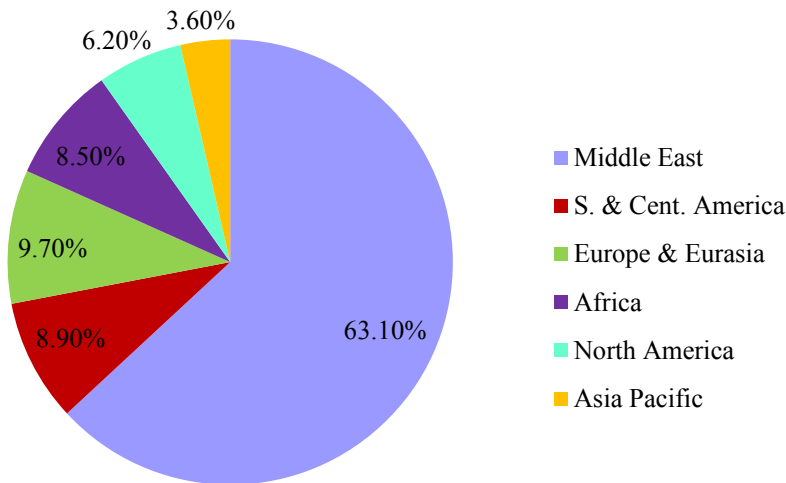
Adisa Azapagic (2012)

Depletion of fossil fuels?

Oil Reserves

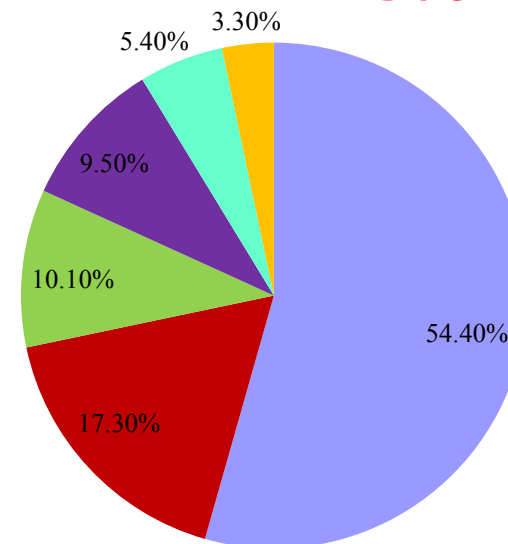
Year 2000

Total: 1105 thousand million barrels



Year 2010

Total: 1383 thousand million barrels



25% increase!

- **Discovery of New Large Oil and Gas Reserves**
- **New technologies for Offshore oil exploration and production**

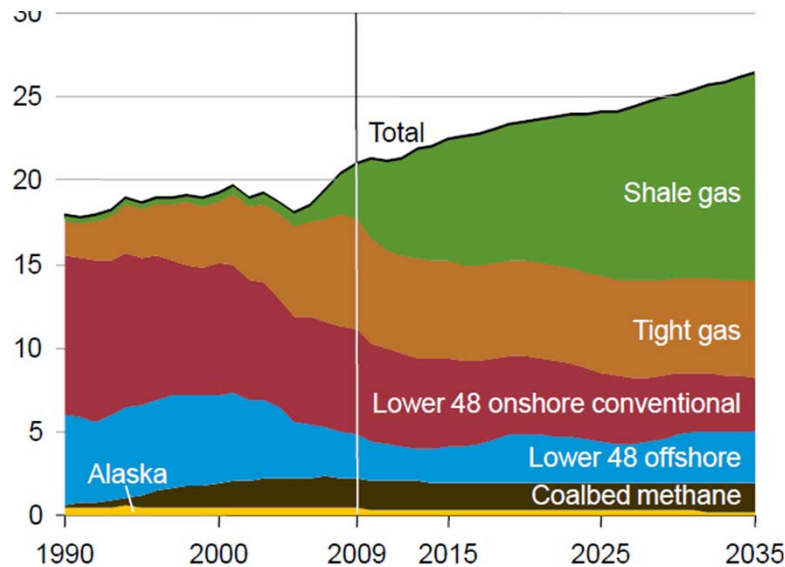
**Statistical Review of World Energy (June, 2011)*



Depletion of fossil fuels?

Growth in Shale Gas

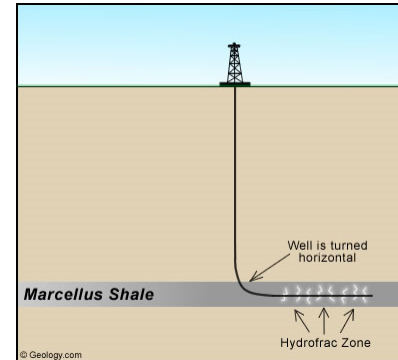
Figure 89. Natural gas production by source, 1990-2035



In 2035 close to 50% from Shale Gas

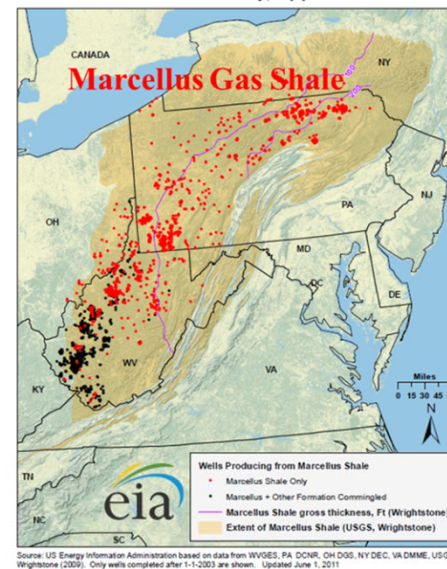
Northeast: from 0.3 trillion scft 2009
to 5.8 trillion scft 2035

Carnegie Mellon



Horizontal drilling
Hydraulic fracturing

Marcellus Shale Gas Play, Appalachian Basin



Large amount "wet gas"

Perspectives Article: Jeff Sirola

The Impact of Shale Gas in the Chemical Industry
AIChE Journal, Volume 60, pp 810–819 (2014)



06-421 Chemical Process Systems Design

Carnegie Mellon University

Design Project:

Preliminary design and cost estimation of Aromatics Plant from Shale Gas

Plant to produce aromatics **500 Milbs/yr***

Aromatics: **Benzene, Toluene, Xylenes** (*ortho, para, meta*)

Plant location: Monaca (next to Shell's projected cracker)

Feedstocks: **methane** (*1 atm, 60F; 95% methane, 2.5% ethane*)?

Price methane: **\$3.50/MBtu**

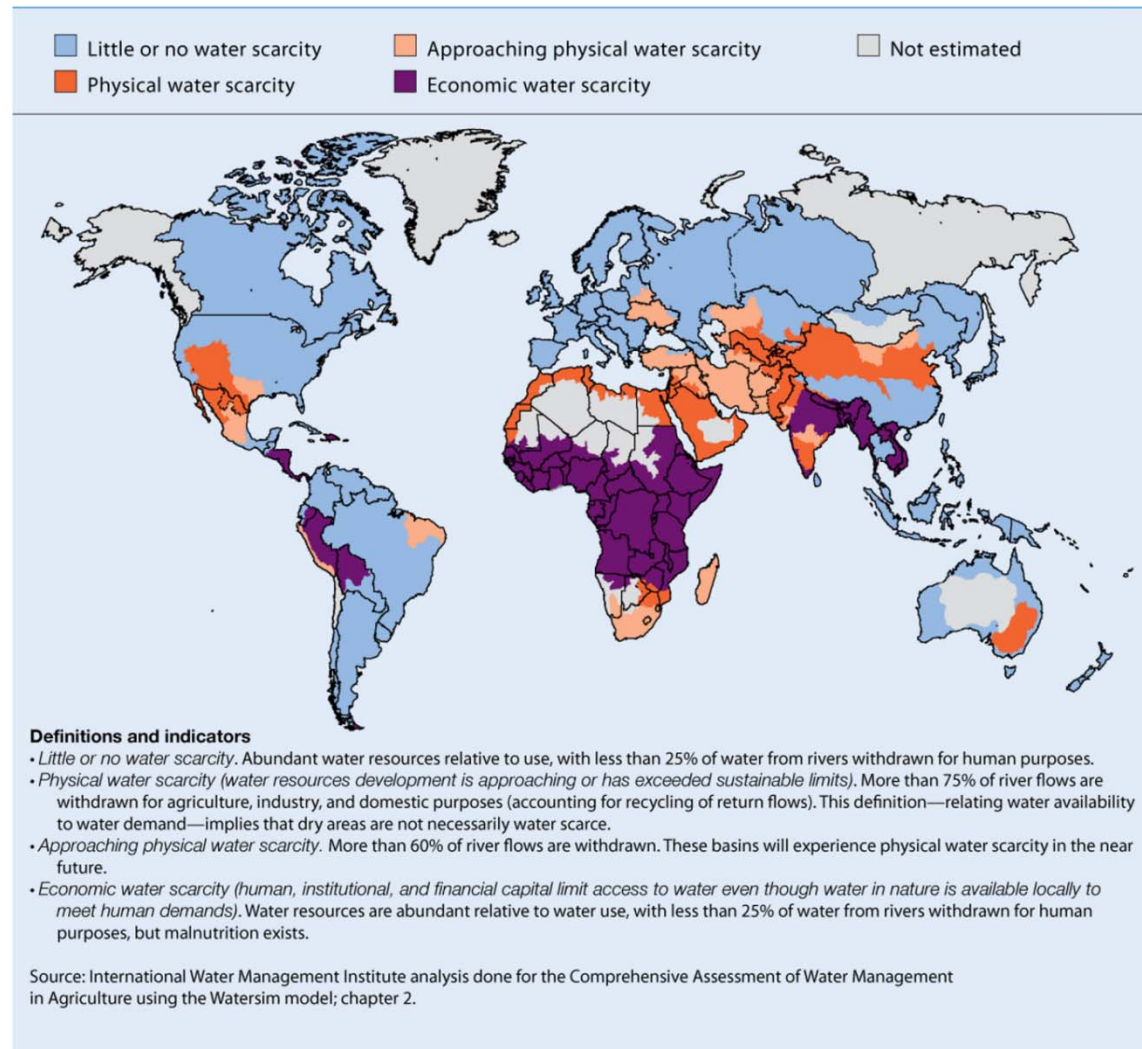
Price Benzene: **\$1,400/tonne**

Price Toluene: **\$1,300/tonne**

Price Xylenes: **\$1,200/tonne** (higher price if separated into o, m, p)

*** M=mega/million**

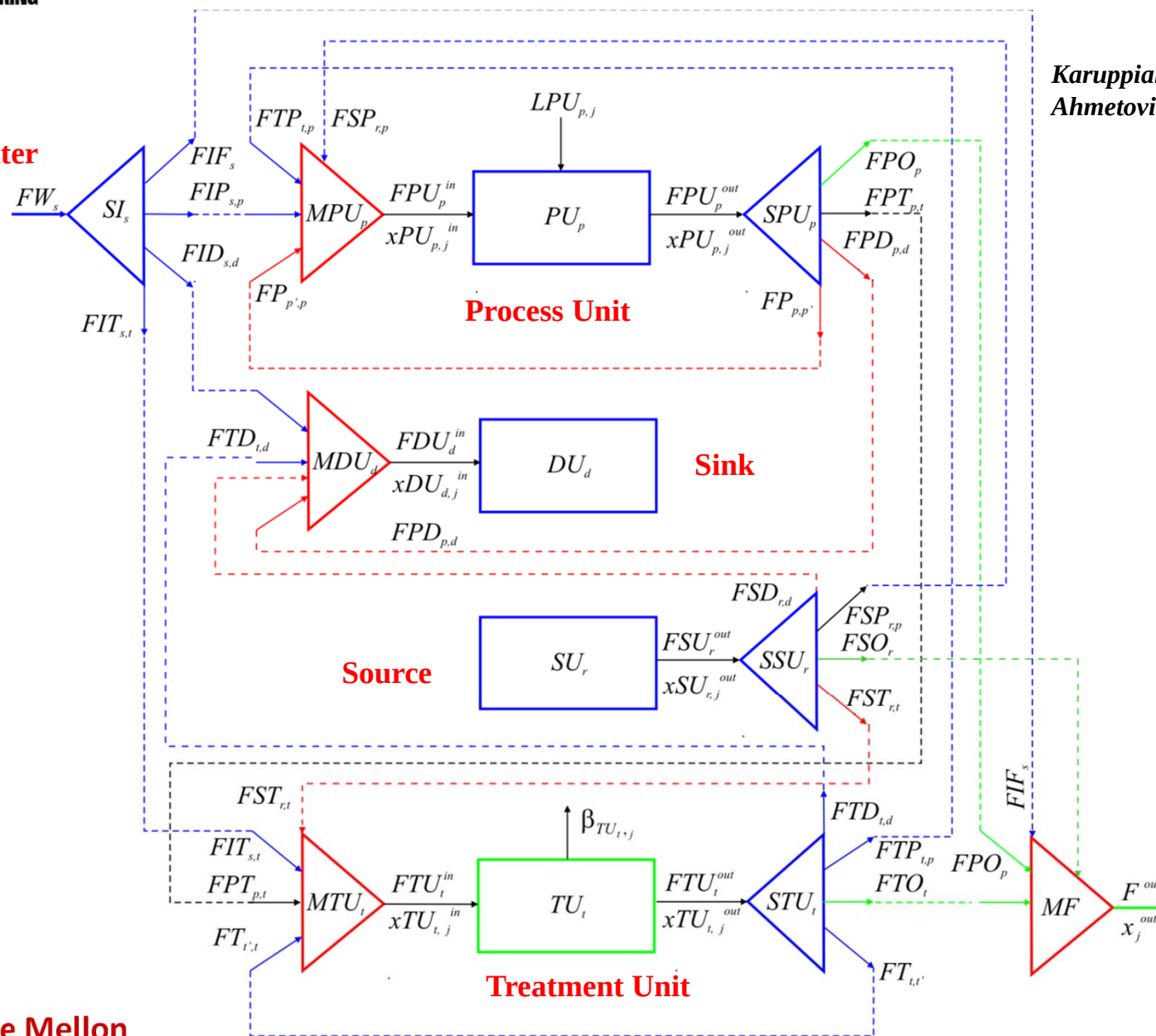
Water scarcity



Two-thirds of the world population will face water stress by year 2025



Freshwater



Carnegie Mellon



Optimization Model

Nonconvex NLP or MINLP

Objective function: *min Cost*

Subject to:

Splitter mass balances

Mixer mass balances (bilinear)

Process units mass balances

Treatment units mass balances

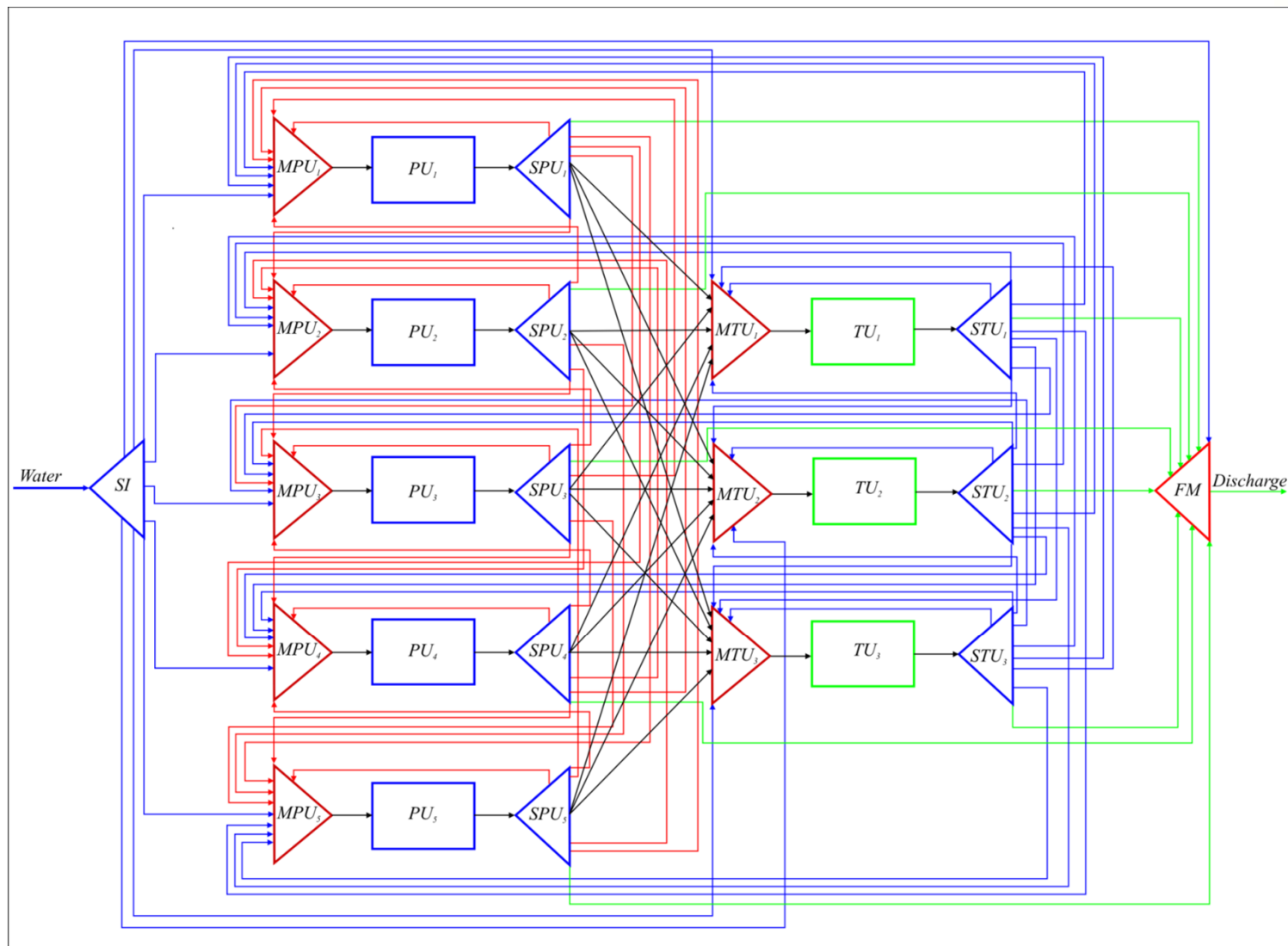
Design constraints

0-1 variables for piping sections

Model can be solved to global optimality

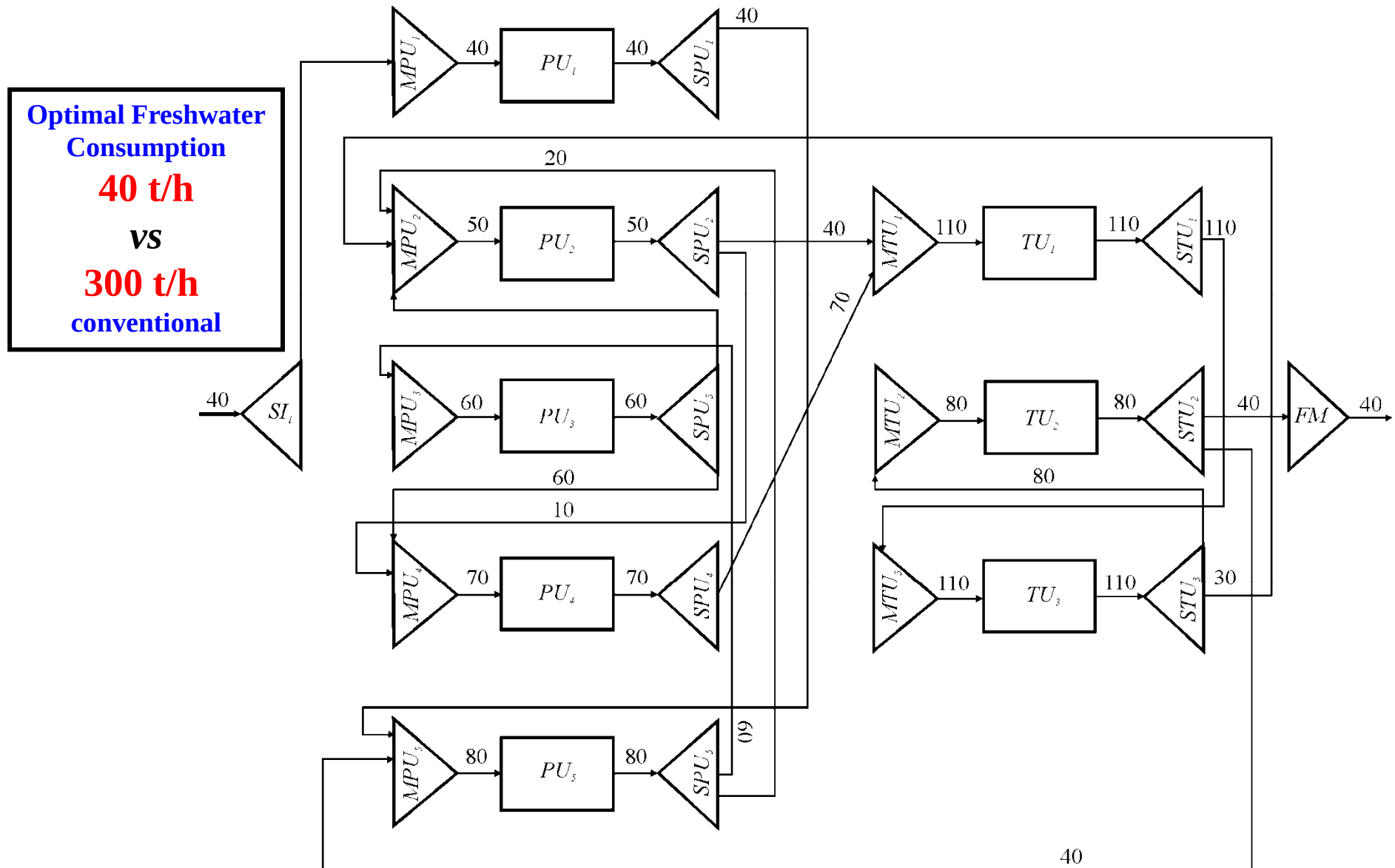
Superstructure of the integrated water network

1 feed, 5 process units, 3 treatment units, 3 contaminants



MINLP: 72 0-1 vars, 233 cont var, 251 constr
 BARON optcr=0.01 197.5 CPUsec

Optimal design of the simplified water network with 13 removable connections



Biofuels: Conceptual Design Strategy for Energy and Water Optimization

Energy optimization

Issue: fermentation reactions at modest temperatures

=> No source of heat at high temperature as in petrochemicals

Multieffect distillation followed by heat integration process streams

Water optimization

*Issue: cost contribution is currently still very small
(freshwater contribution < 0.1%)*

=> Total cost optimization is unlikely to promote water conservation

Optimal process water networks for minimum energy consumption



Scope of Advanced Process Systems Engineering Tools



Energy consumption corn-based process

Author (year)	Energy consumption (Btu/gal)
Pimentel (2001)	75,118
Keeney and DeLuca (1992)	48,470
Wang et al. (1999)	40,850
Shapouri et al. (2002)	51,779
Wang et al (2007)	<u>38,323</u>

From Karrupiah et al (2007)
24,918 Btu/gal vs 38,323 Btu/gal
Why? Multieffect distillation and heat integration

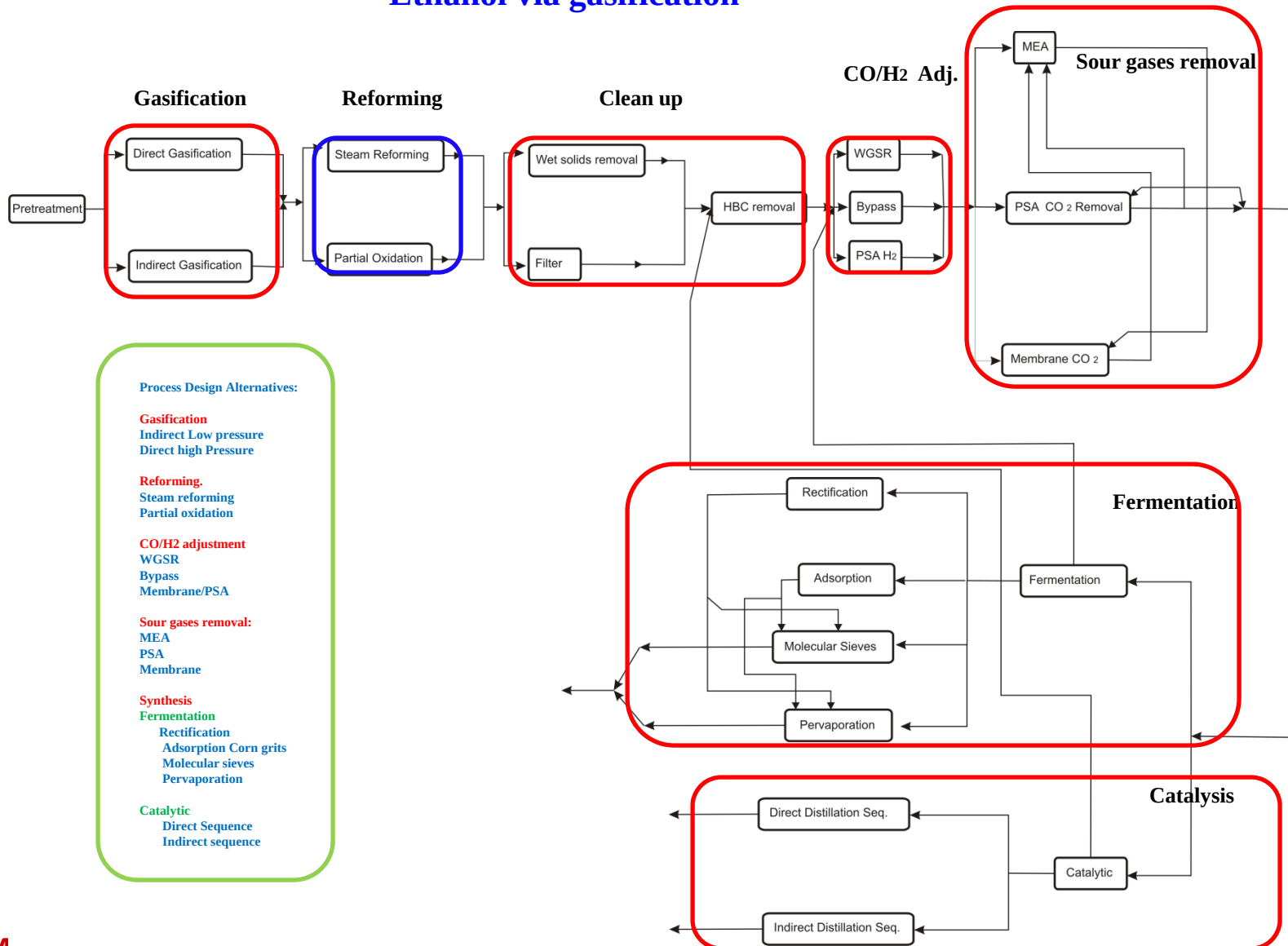
Water consumption corn-based process

Author (year)	Water consumption (gal/gal ethanol)
Gallager (2005) First plants	11
Philips (1998)	5.8
MATP (2008) Old plants in 2006	4.6
MATP (2008) New plants	<u>3.4</u>

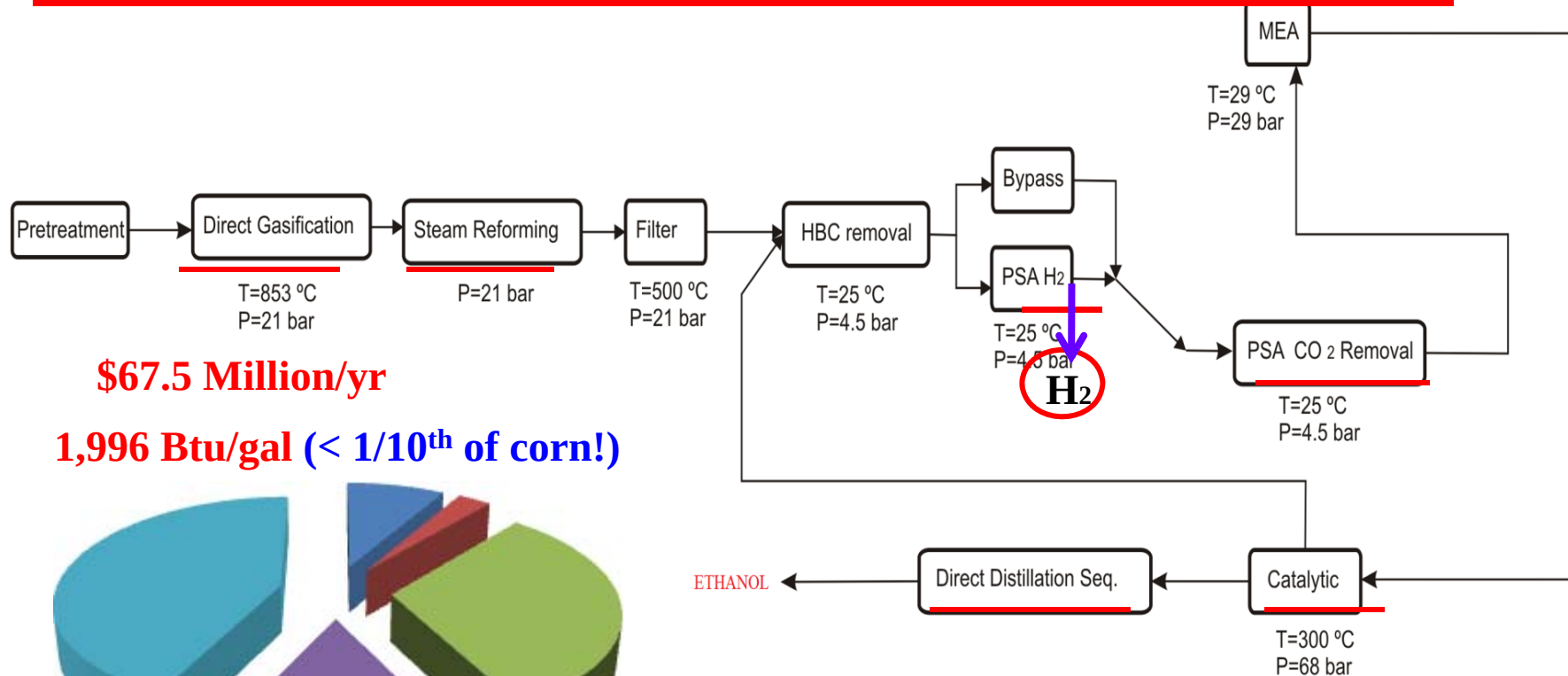
From Martin and Grossmann (2010)
1.5 gal water/gal ethanol vs 3.4
Why? Integrated process network with reuse and recycle

Ethanol via gasification

Martin, Grossmann (2010)

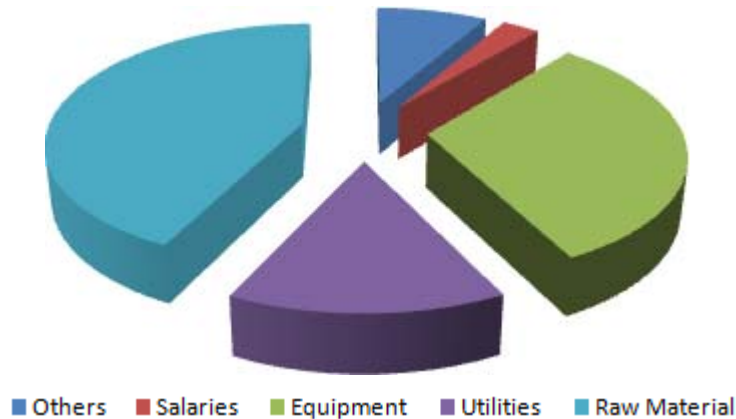


Optimal Design of Lignocellulosic Ethanol Plant



\$67.5 Million/yr

1,996 Btu/gal (< 1/10th of corn!)



Each NLP subproblem: 7000 eqs., 8000 var
~25 min to solve

Ethanol: \$0.81 /gal (no H₂ credits)
\$ 0.41/gal (H₂ credits)

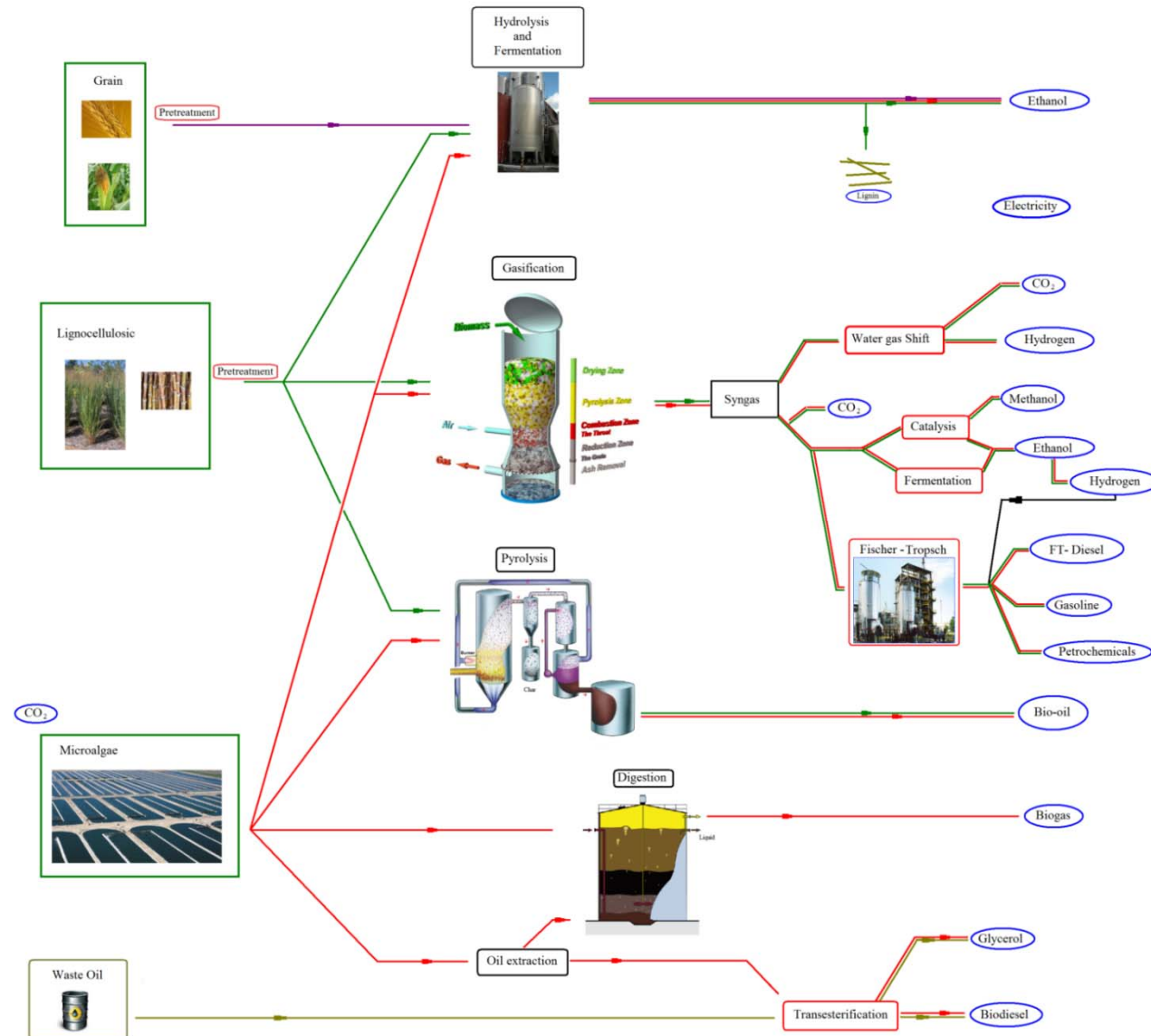
Low cost is due to H₂ production

Biorefinery

Bioethanol, FT-diesel and hydrogen from switchgrass

Biodiesel from cooking oil or algae oil

Martin, Grossmann (2012)

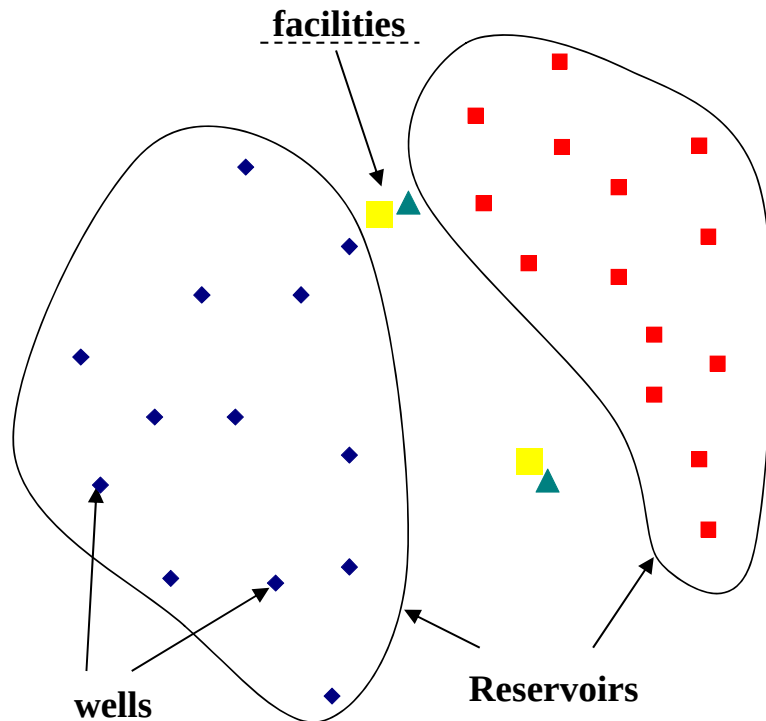


Optimal Development of Oil Fields (*deepwater*)

Offshore field having several reservoirs (oil, gas, water)

ExxonMobil

Gupta, Grossmann (2011)



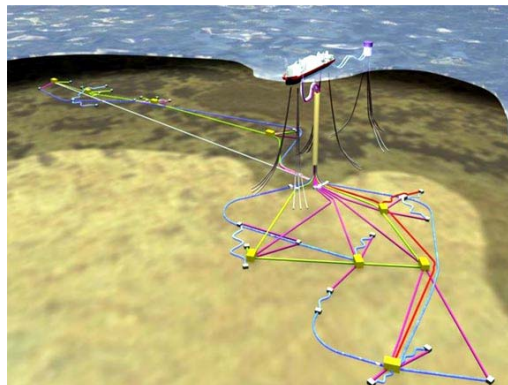
Decisions:

- Number and capacity of FPSO facilities
- Installation schedule for facilities
- Number of sub-seawells to drill
- Oil/gas production profile over time

Objective:

- **Maximize the Net Present Value (NPV) of the project**

FPSO (*Floating Production Storage Offloading*)



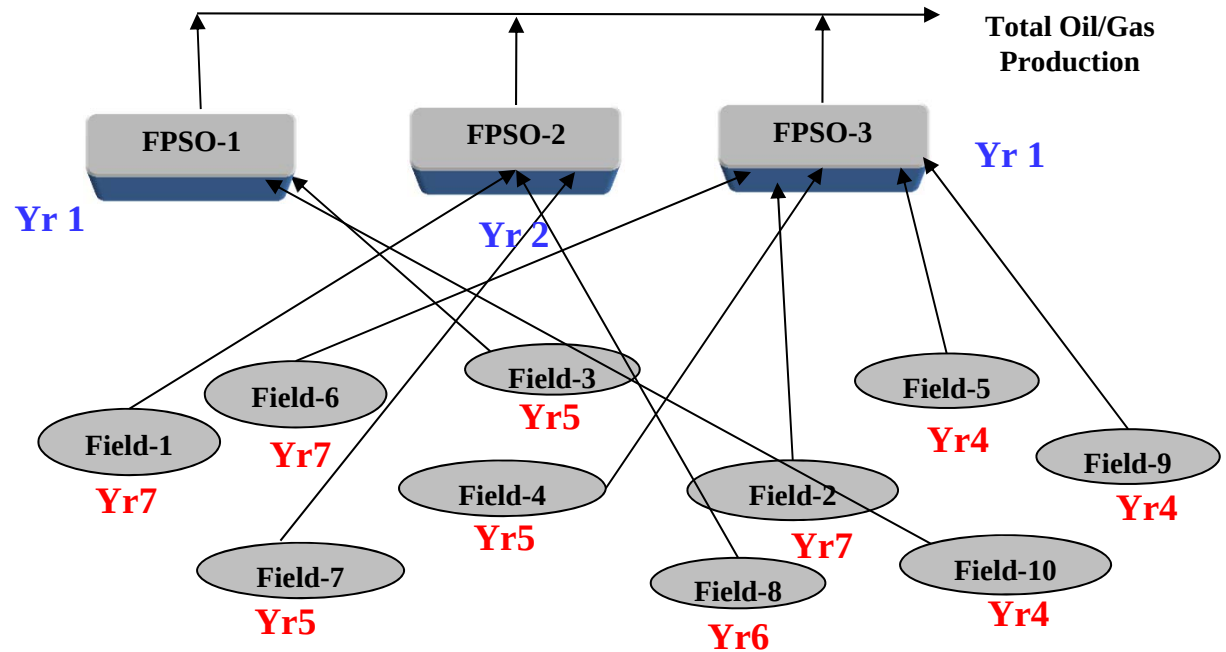
MINLP model

- Nonlinear reservoir behavior
- Three components (oil, water, gas)
- Lead times for FPSO construction
- FPSO Capacity expansion
- Well Drilling Schedule

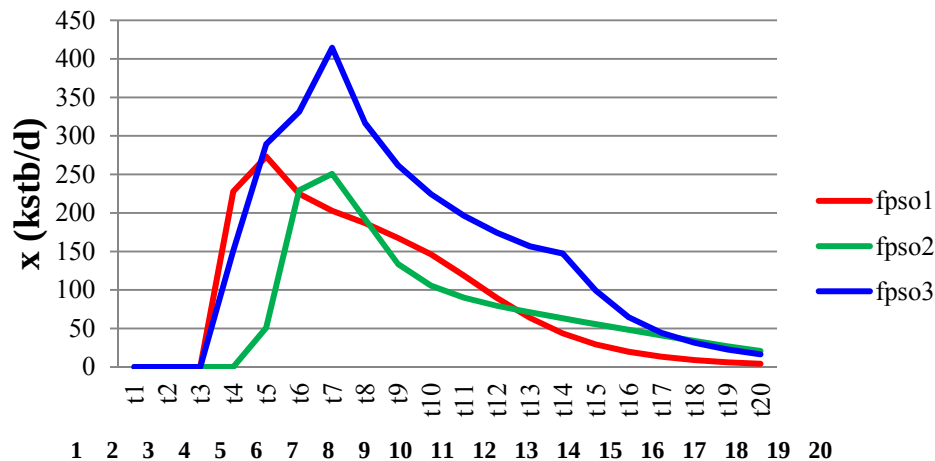
Example

Optimal NPV = \$30.946 billion

20 Year Time Horizon
10 Fields
3 FPSOs
23 Wells
3 Yr lead time FPSO
1 Yr lead time expansion

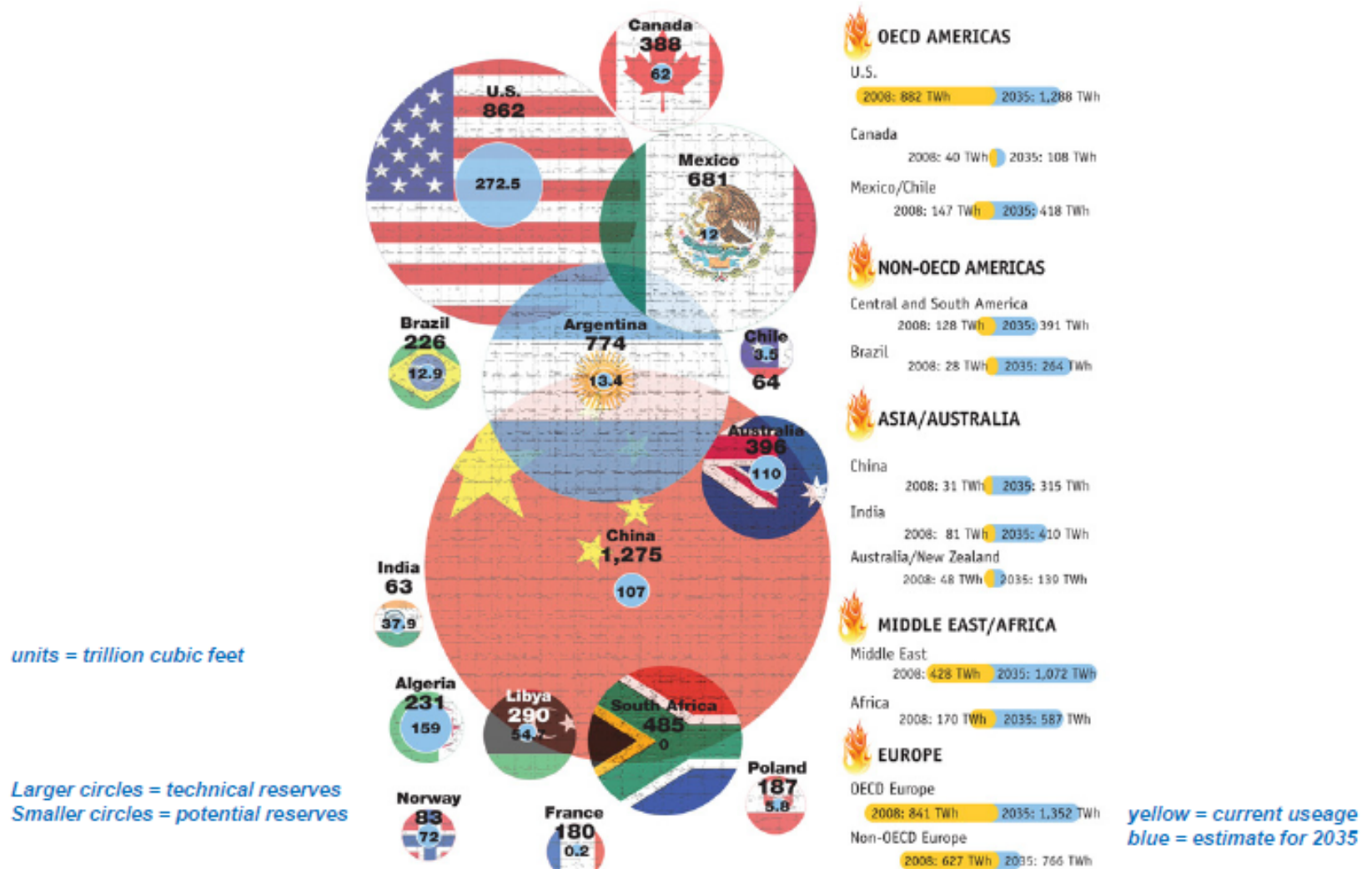


Oil Flowrate



	MINLP
Discrete Var.	483
SOS1 Var.	0
Continuous Var.	5,684
Constraints	9,877
Solver	DICOPT 2x-C
NPV (billion dollars)	30.946
CPU time(s)	67

Shale Gas Reserves in World

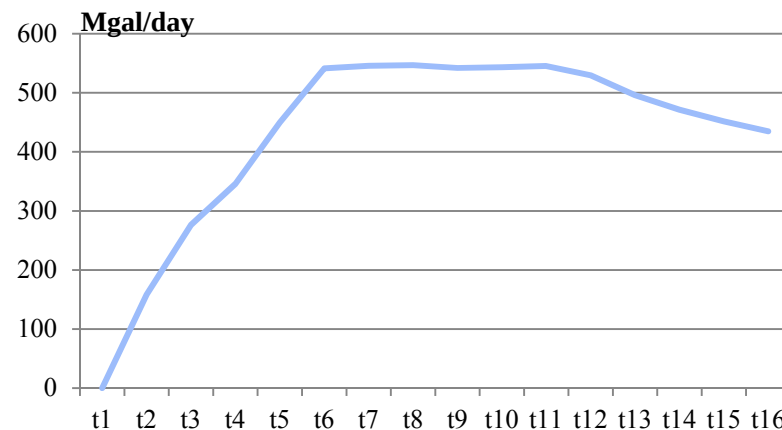
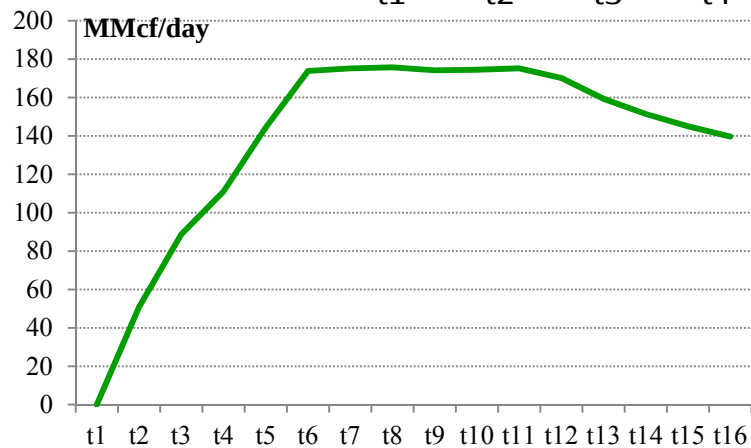
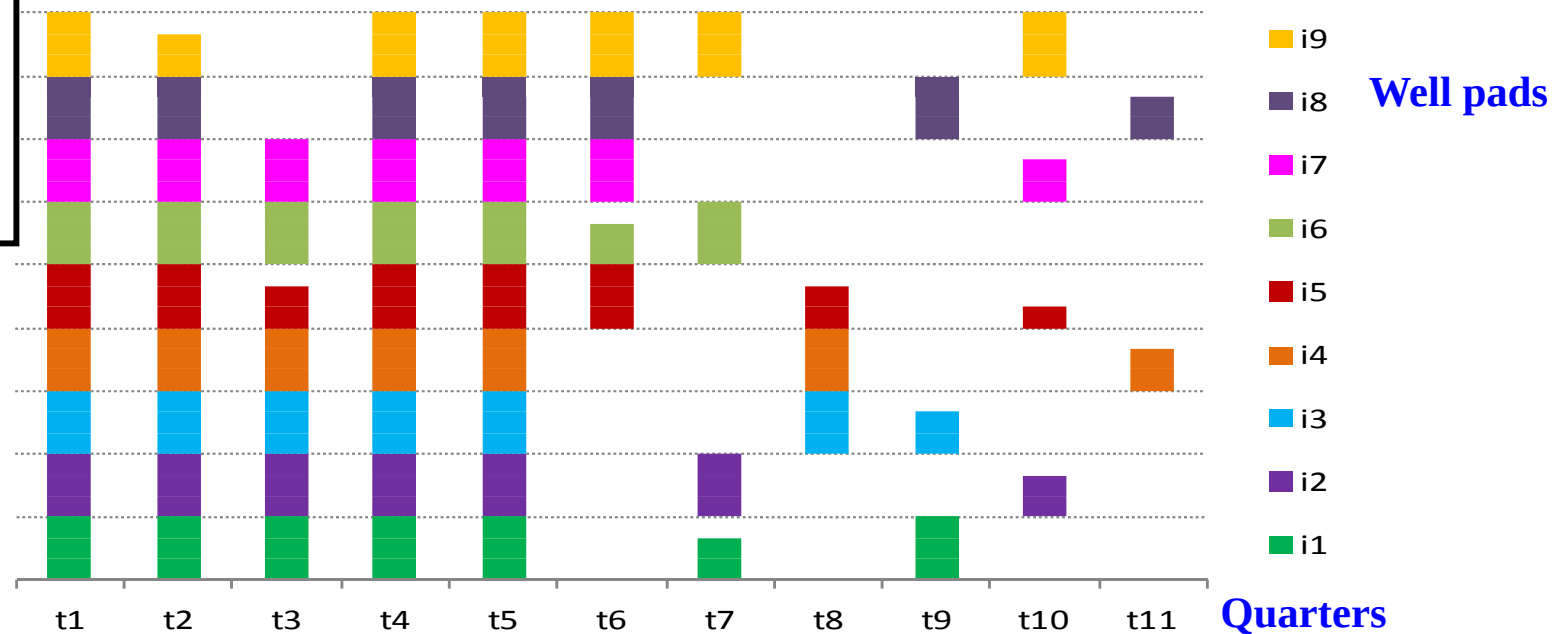


Sonal Patel, "THE BIG PICTURE: A Shale Gas Revolution", Power, June 2012

MINLP Optimization Model

Cafaro, Grossmann (2013)

9 well-pads
 20 wells per pad
 3 potential plants
 10 years
 40 periods



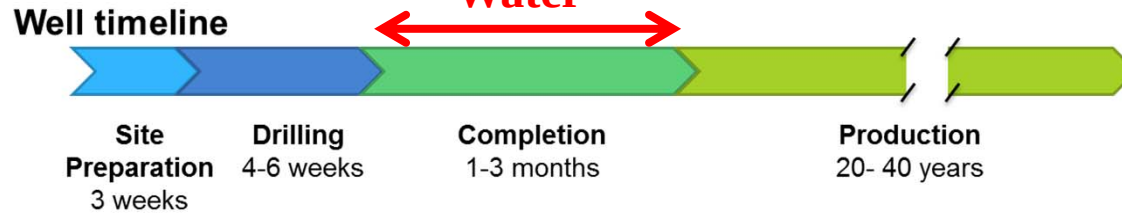


Water use in hydraulic fracturing large but over short periods

Yang, Grossmann (2013)



Large volume of water (3-5 MM gallons) to complete a well
Water

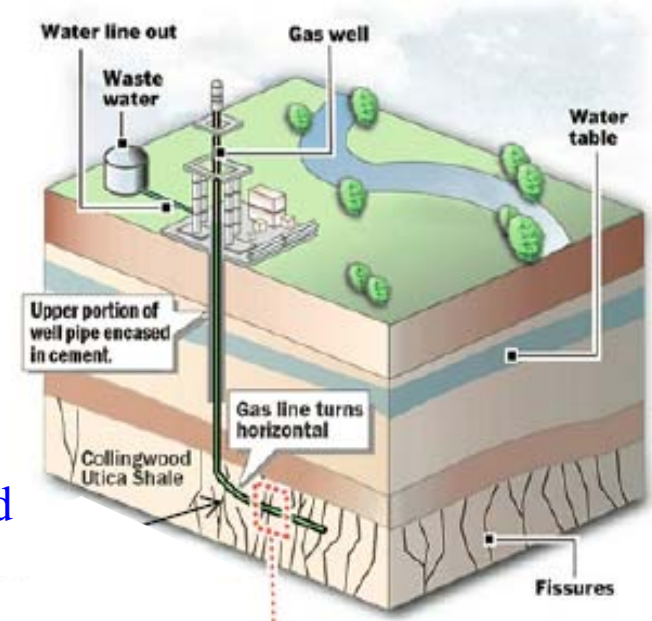


» Most water used (65-80%) in fracking for shale is consumed

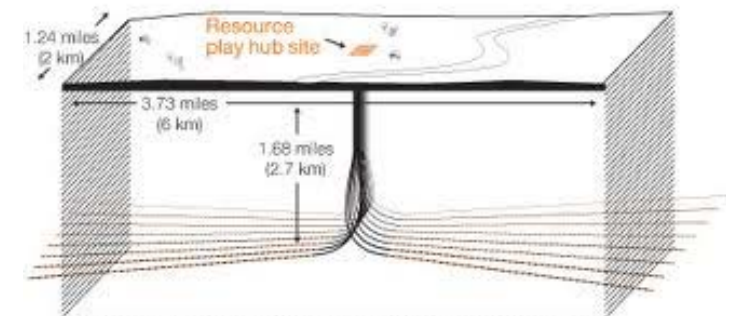
- > Accounts for 0.3% of all water **consumption** in the US¹
- > Accounts for 0.1% of all freshwater **withdrawal** in the US¹

Flowback water treated for reuse

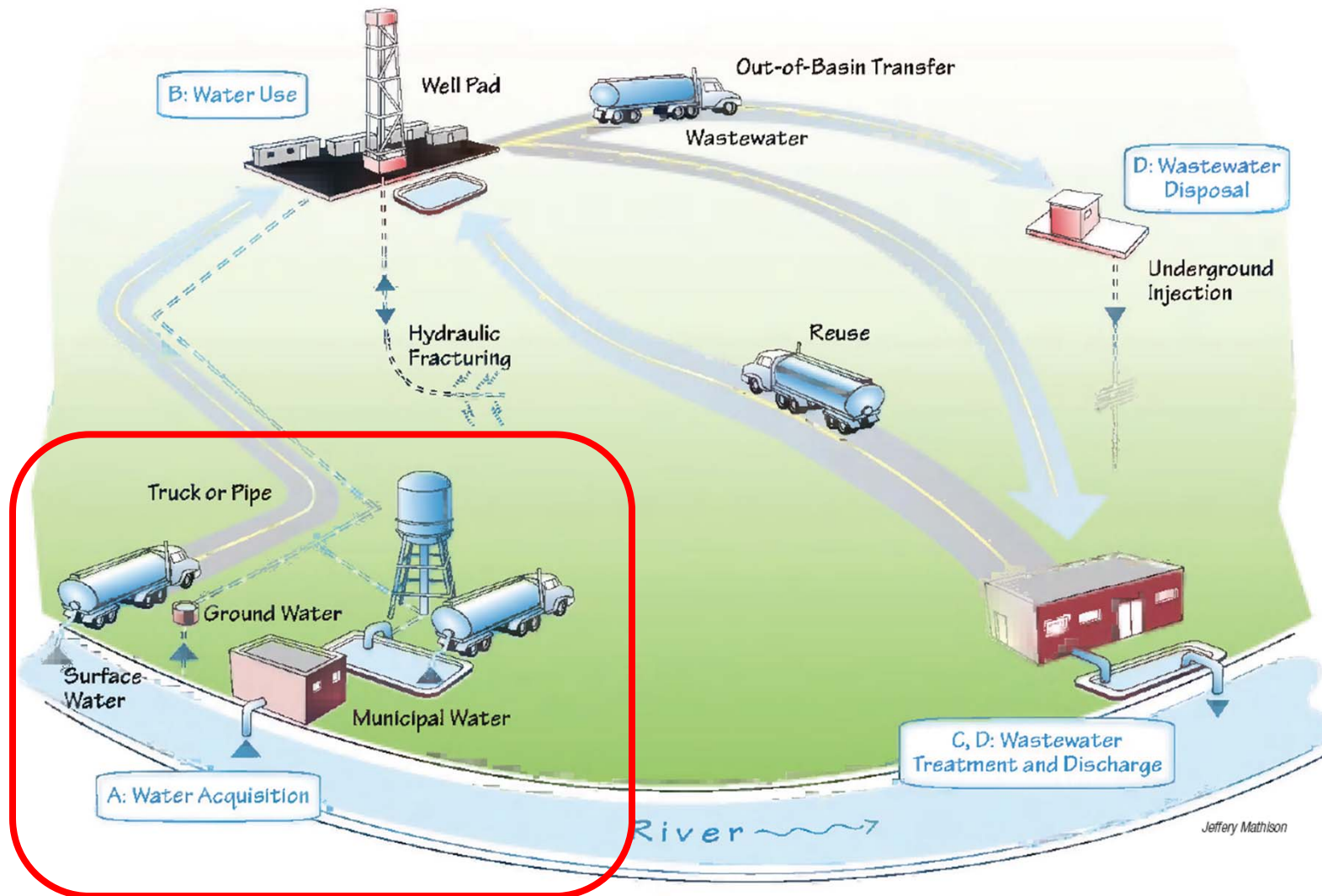
1.3 gal/MMBtu for shale gas
vs 7 coal/slurry and 50 oil



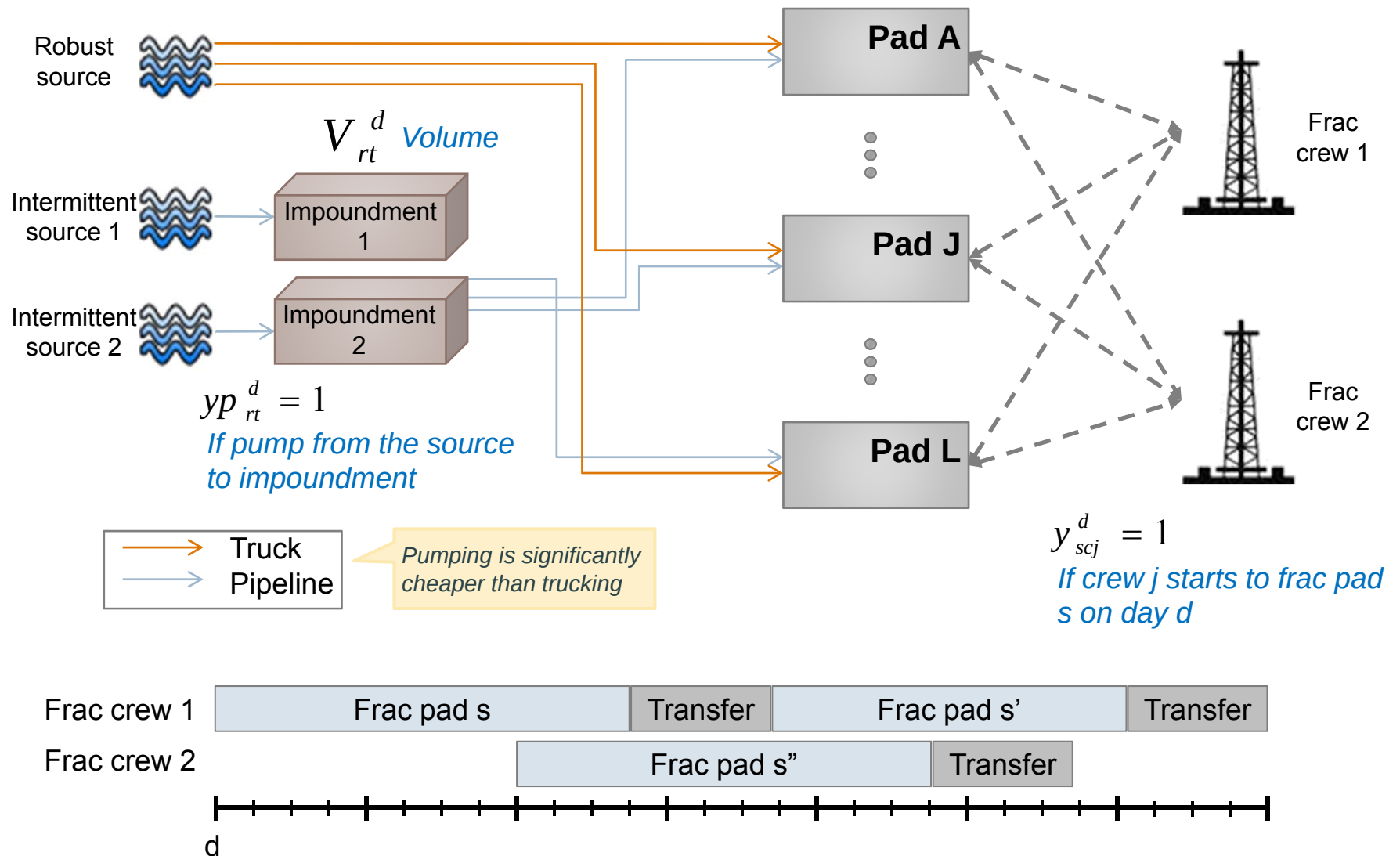
Multi-well pads



Water use logistics in Shale Gas production



Scheduling model: STN discrete-time MILP model *(Kondili, Pantelides, Sargent, 1993)*



Example: results

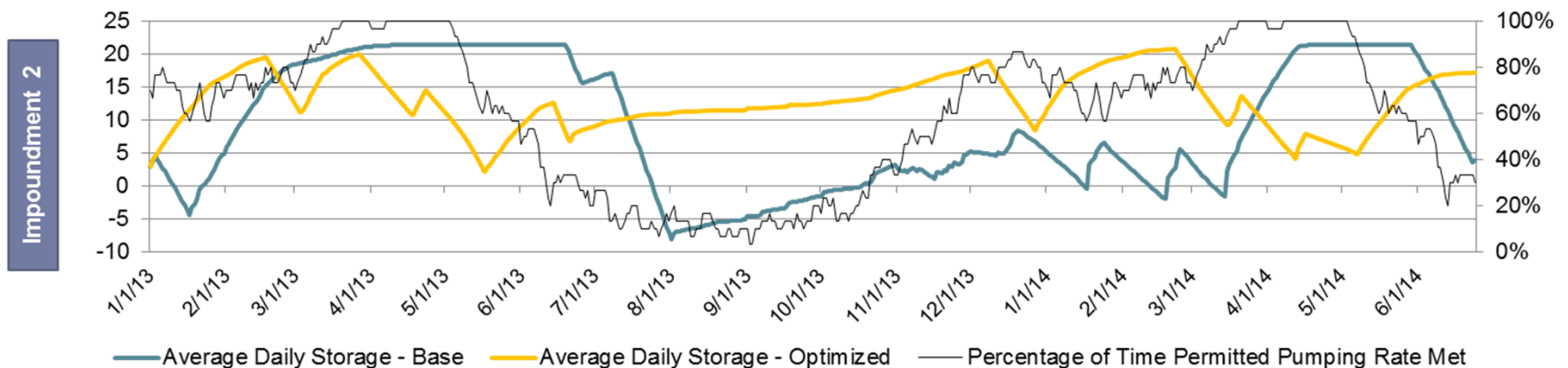


14 well pads
540 time periods
2 impoundments
1 frac crew

	Heuristic schedule	MILP schedule [‡]
Trucking cost	\$5,886,743	\$568,827
Pumping cost	\$9,905,219	\$12,792,088
Total expected cost (\$)	\$15,791,963	\$13,360,915

Trucking cost is reduced by an order of magnitude.

- ▶ 14,010 → 1,350 truck trips.
- ▶ CO₂ emissions from trucking reduced from 630 → 60 metric tons



Heuristic schedule



MILP schedule



III. Enterprise-wide Optimization

Beyond the plant level/ Integration with business operations



Wellhead

**Trade &
Schedule
Crude and
Other
Feedstocks**

**Transfer of
Crude and
Feedstocks
to Refinery**

**Refinery
Optimization**

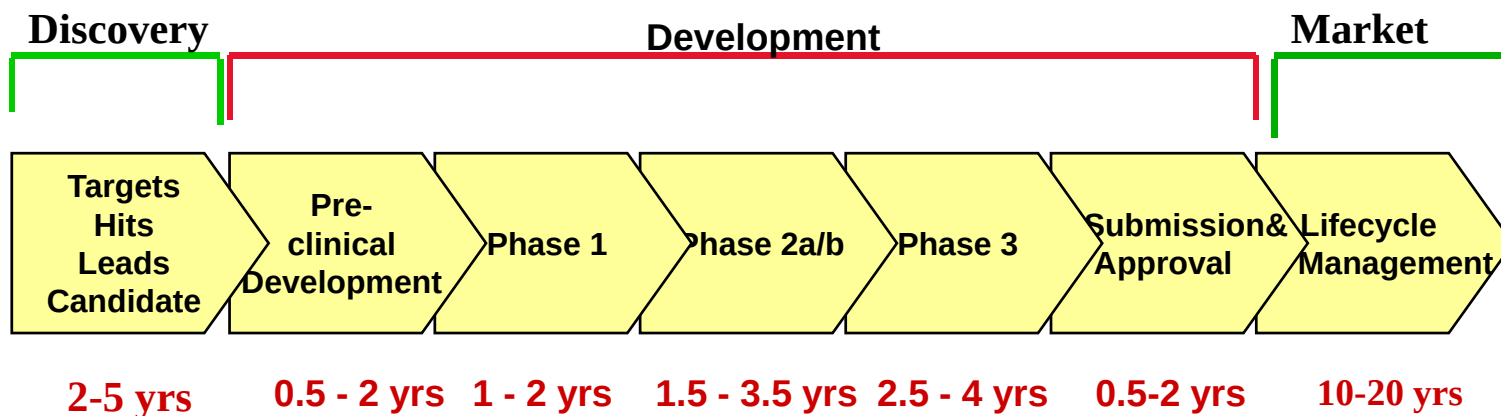
**Trade &
Schedule
Products**

**Transfer of
Products
from
Refinery
to Terminal**

**Terminal
Loading**

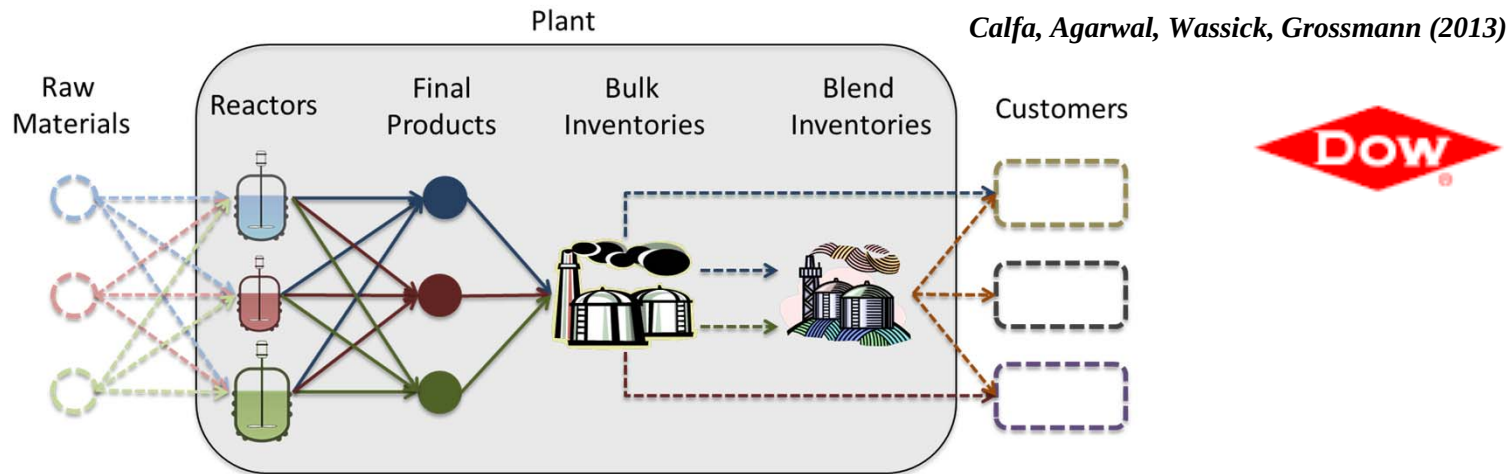
Pump

Dennis Houston (ExxonMobil)



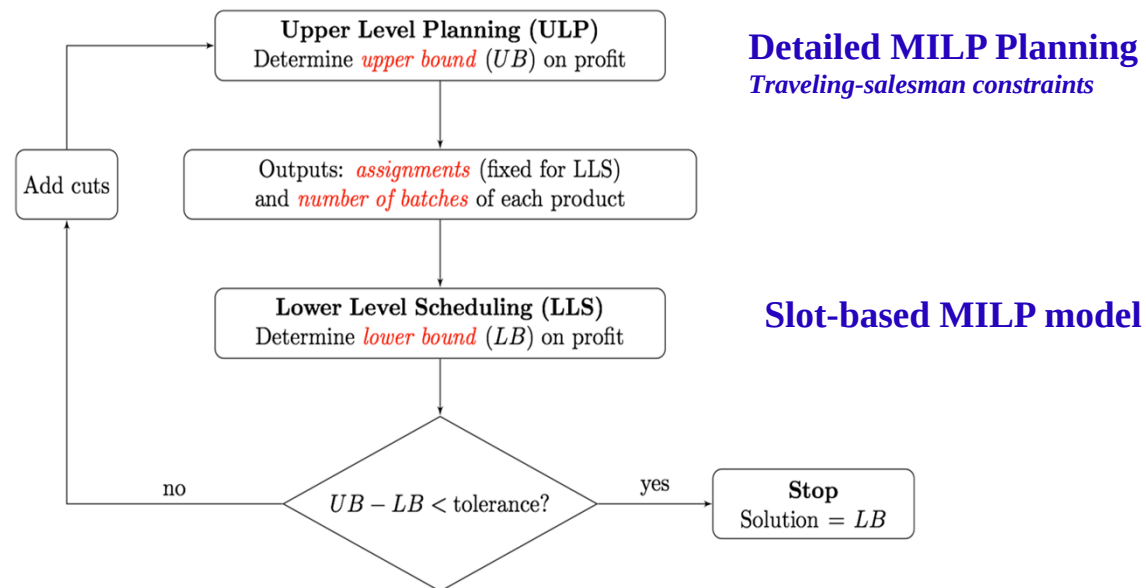
Colin Gardner (Transform Pharmaceuticals)

Integrated Planning and Scheduling Batch Plant



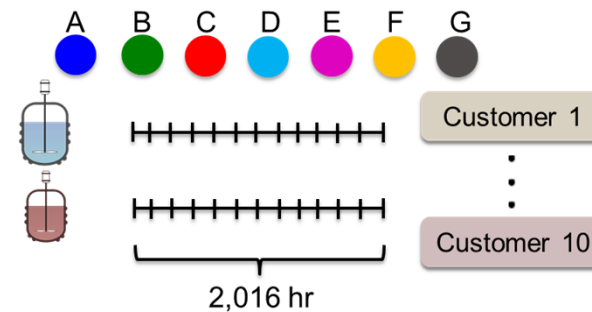
- Batch units operating in **parallel**
- **Sequence-dependent changeovers** between products groups
- A subset of products are **blended**

Bi-level Decomposition

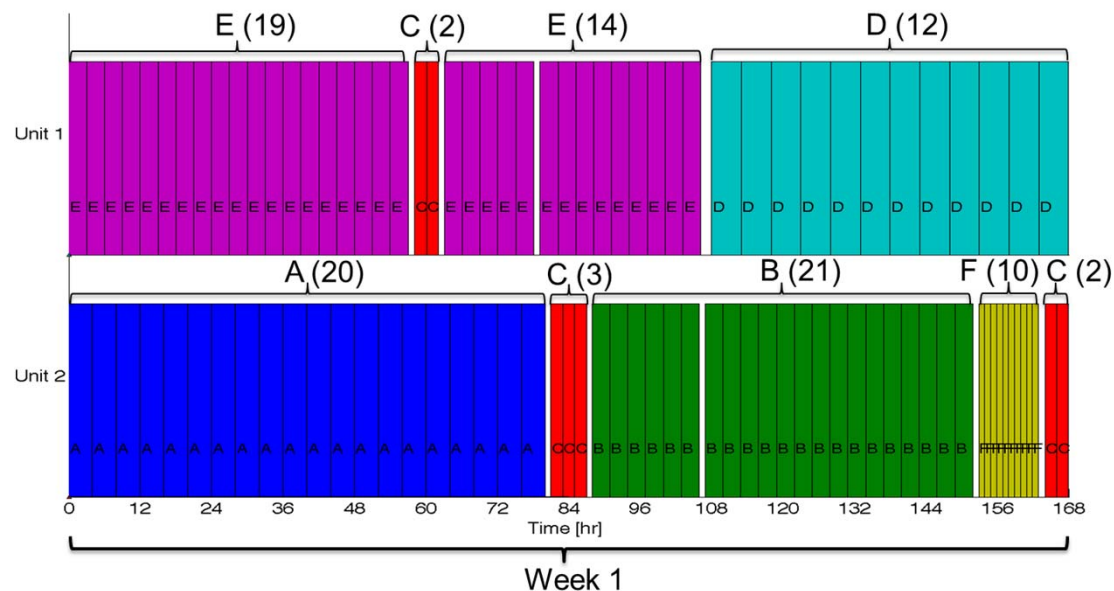


Example

2 parallel units
 2 raw materials
 7 products (6 individual and 1 blended)
 10 customers
 Time horizon
 12 weeks



Optimal Schedule (week 1)



Bilevel decomposition converged in one iteration!

Upper level MILP: 1,032 0-1 1,800 cont.v. 3,300 constr. **2.5 sec**

Lower level MILP: 19,600 0-1 23,100 cont.v. 15,300 constr **479 sec**

Optimal Multi-scale Capacity Planning under Hourly Varying Electricity Prices

Mitra, Grossmann (2012)



Price forecast **Demand Side Management**

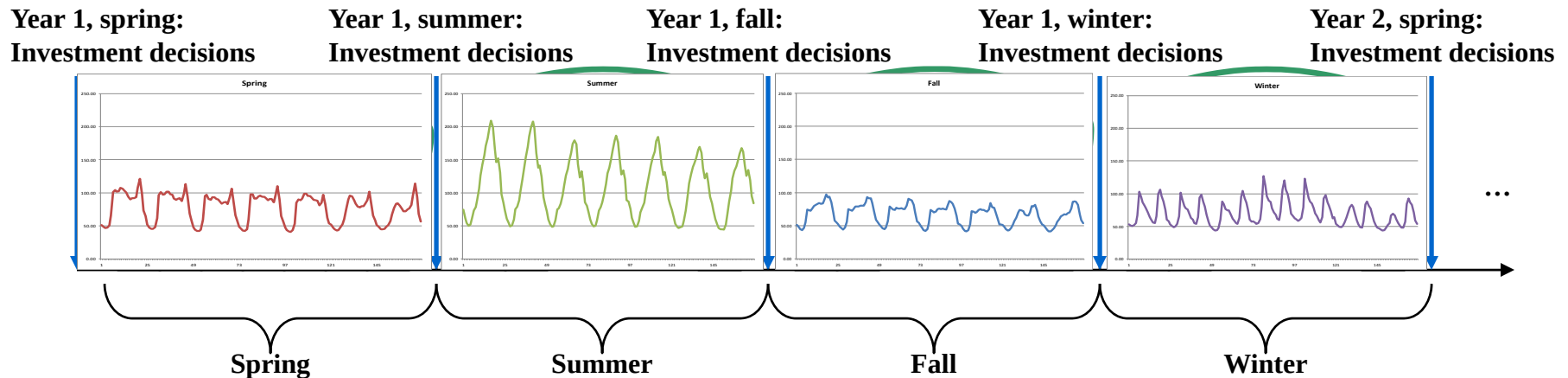
Given:

- Power-intensive plant
- Products $g \in G$ (Storable and Nonstorable)
- Product demands d_g^t for season $t \in T$
- Seasonal electricity prices on an hourly basis $e^{t,h}$, $t \in T$, $h \in H$
- Upgrade options $u \in U$ of existing equipment
- New equipment options $n \in N$
- Additional storage tanks $st \in ST$

Determine:

- Production levels $Pr^{t,h}$
 - Mode of operation $\tilde{y}_{m,o}^{t,h}, y_m^{t,h}$
 - Sales $S_g^{t,h}$
 - Inventory levels $INV_g^{t,h}$
- for each season on an hourly basis
- Upgrades for equipment $VU_{m,u}^t$
 - Purchase of new equipm. VN_n^t
 - Purchase of new tanks $VS_{st,g}^t$

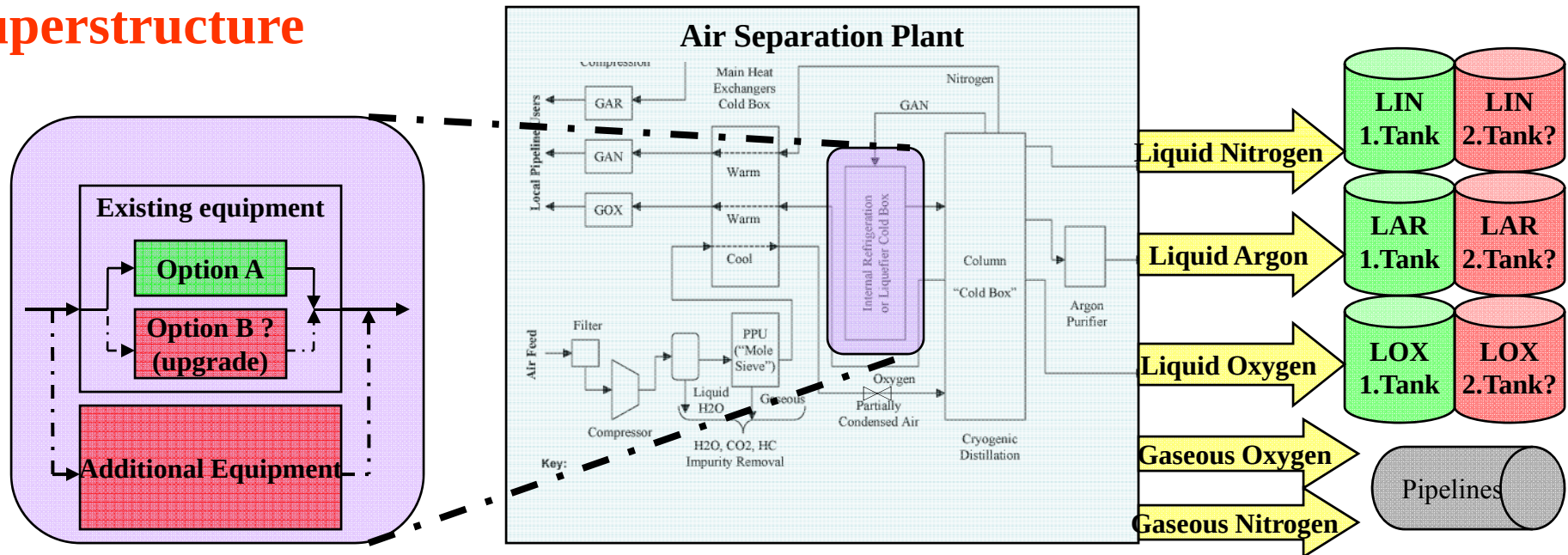
With minimum investment and operating costs



- Horizon: 5-15 **years**, each year has 4 **periods** (spring, summer, fall, winter)
- Each period is represented by **one week on an hourly basis**
- Each representative week is repeated in a **cyclic** manner (**13** weeks reduced to **1** week)
(8736 hr vs. 672 hr)
- Design decisions are modeled by **discrete equipment sizes**

$\min \quad OBJ = \sum_t (Cost_{ops}^t + Cost_{invest}^t) \quad (37)$		
Operational Disjunction over the modes that describe the feasible region	Operational Logic constraints for transitions (e.g. minimum uptime/downtime)	Operational Mass balances for inventory, constraints related to demand
Strategic Additional storage	Strategic Equipment replacement Idea: the corresponding mode has an alternative feasible region	Terms for the objective function
Strategic Additional equipment Idea: additional modes for which all variables are controlled by the corresponding binary investment variable		

Superstructure



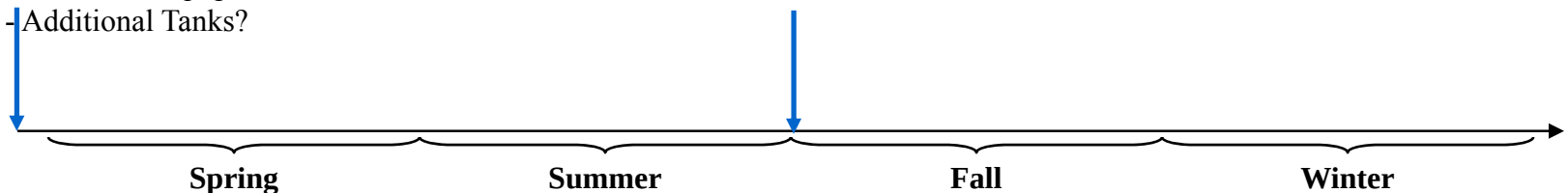
Time

Spring - Investment decisions:
(yes/no)

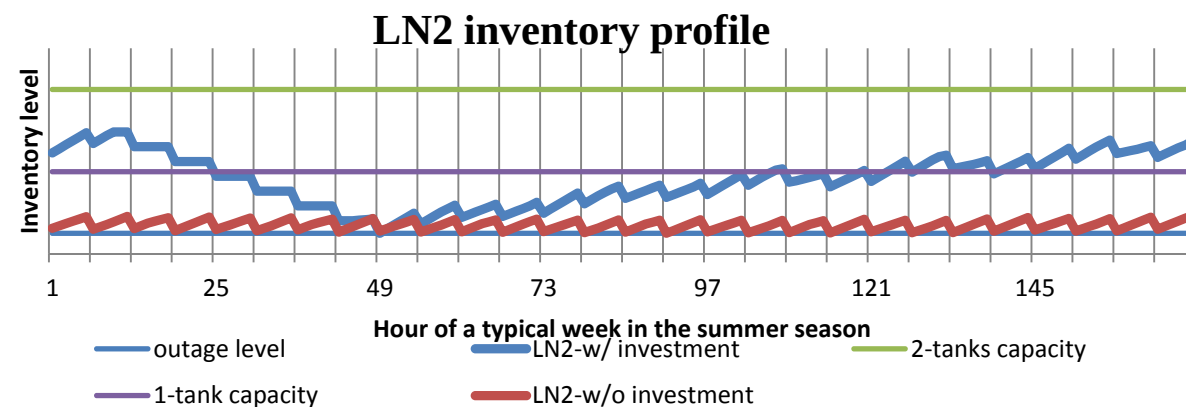
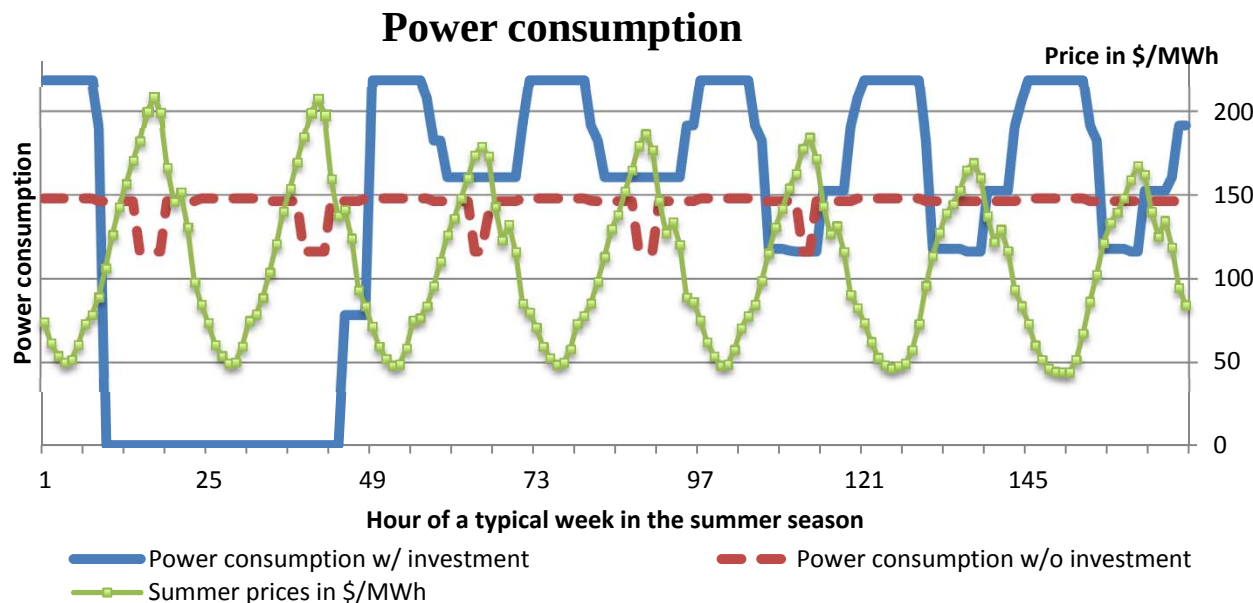
- Option B for existing equipment?
- Additional equipment?
- Additional Tanks?

Fall - Investment decisions: (yes/no)

- Option B for existing equipment?
- Additional equipment?
- Additional Tanks?



- The resulting MILP has **191,861 constraints** and **161,293 variables (18,826 binary.)**
- Solution time: **38.5 minutes** (GAMS 23.6.2, GUROBI 4.0.0, Intel i7 (2.93GHz) with 4GB RAM).

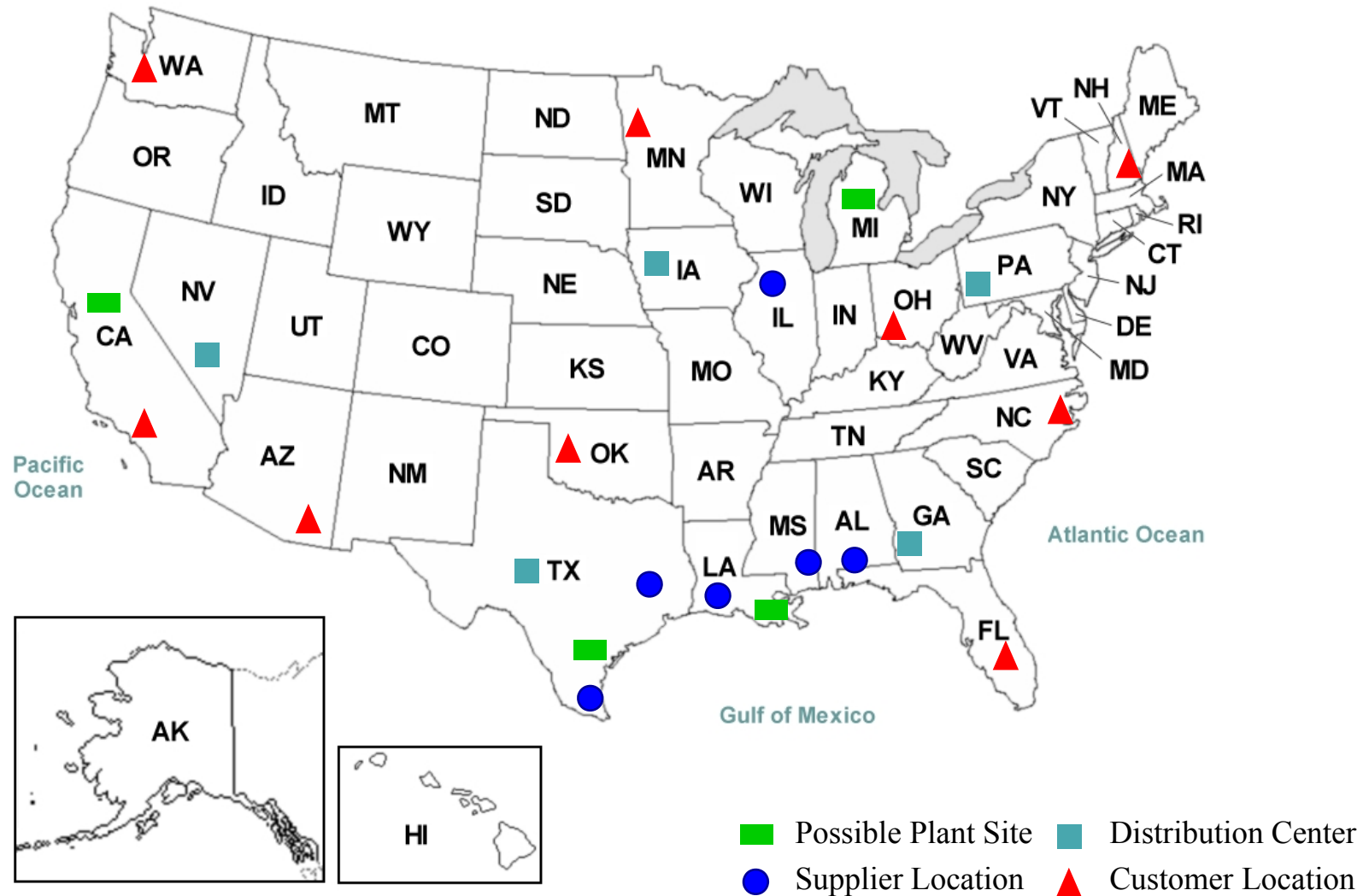


Remarks on case study

- **Annualized costs: \$5,700,000/yr**
- **Annualized savings: \$400,000/yr**
- Buy **new liquefier** in the first time period (annualized investment costs: \$300k/a)
- Buy **additional LN2 storage tank** (\$25k/a)
- **Don't upgrade** existing equipment (\$200k/a) equipment: 97%.

Objective: design supply chain polystyrene resins under **responsive** and **economic** criteria

You, Grossmann (2008)

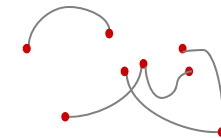


Example

Potential Network Superstructure



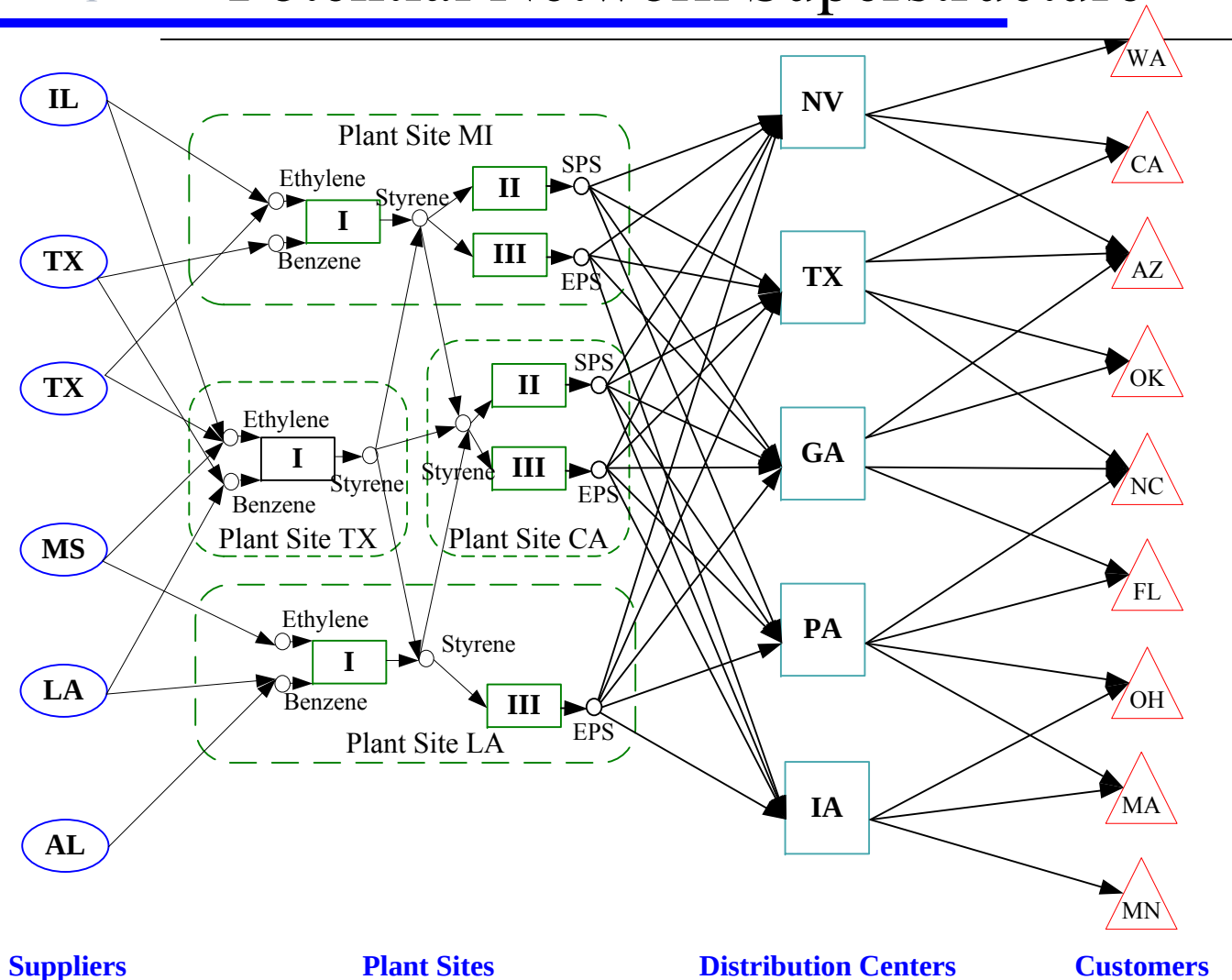
Network Structure



Operational Plan



Production Schedule



Max: Net present value

Max: Responsiveness

Demand
uncertainty

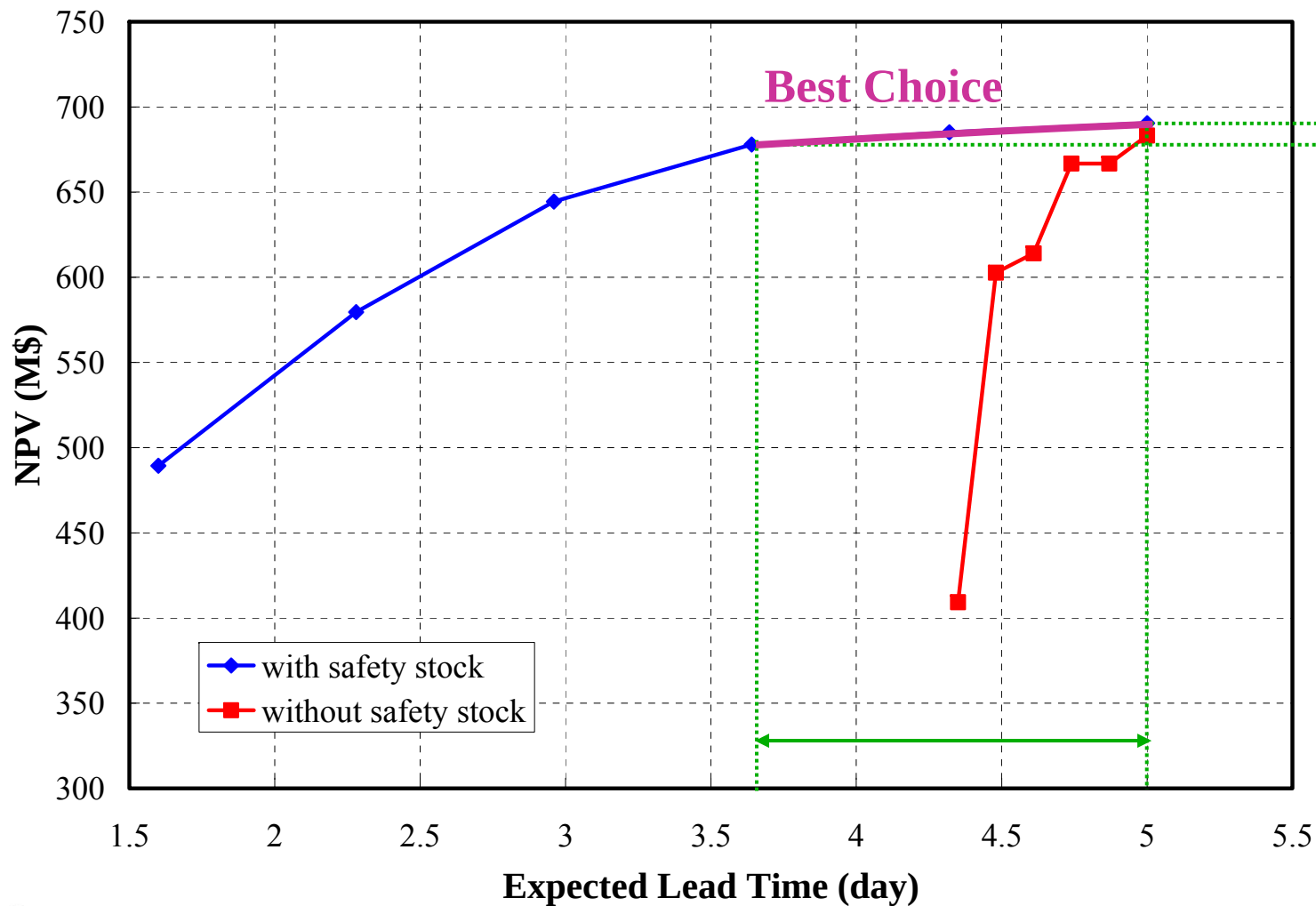


⇒ Responsiveness
Expected Lead Time

Example **Bi-criterion Multiperiod MINLP**



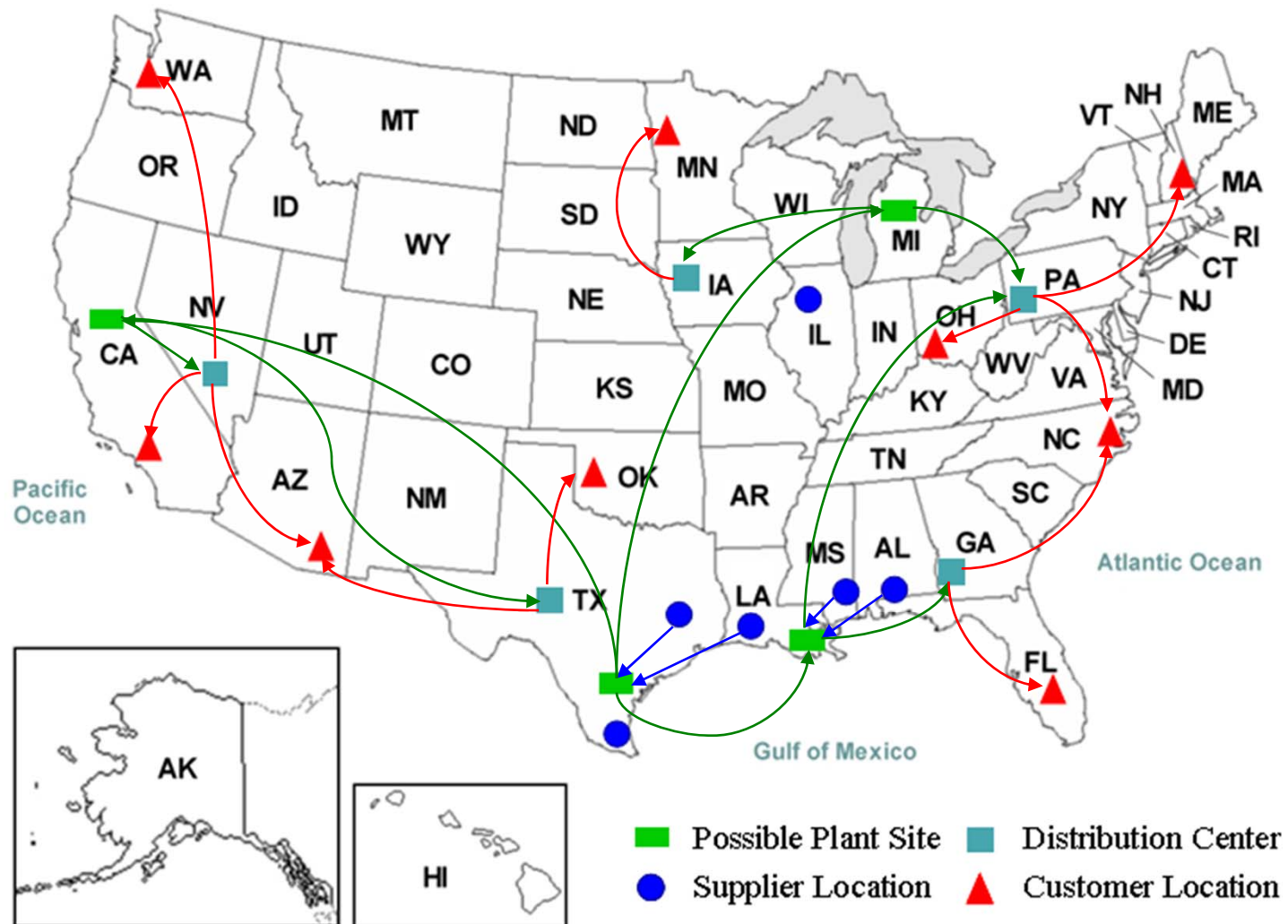
Pareto Curves – with and without safety stock





Network Structure at Location Map

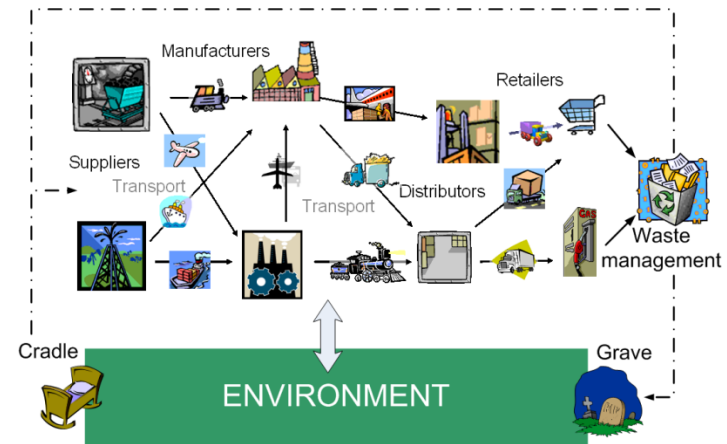
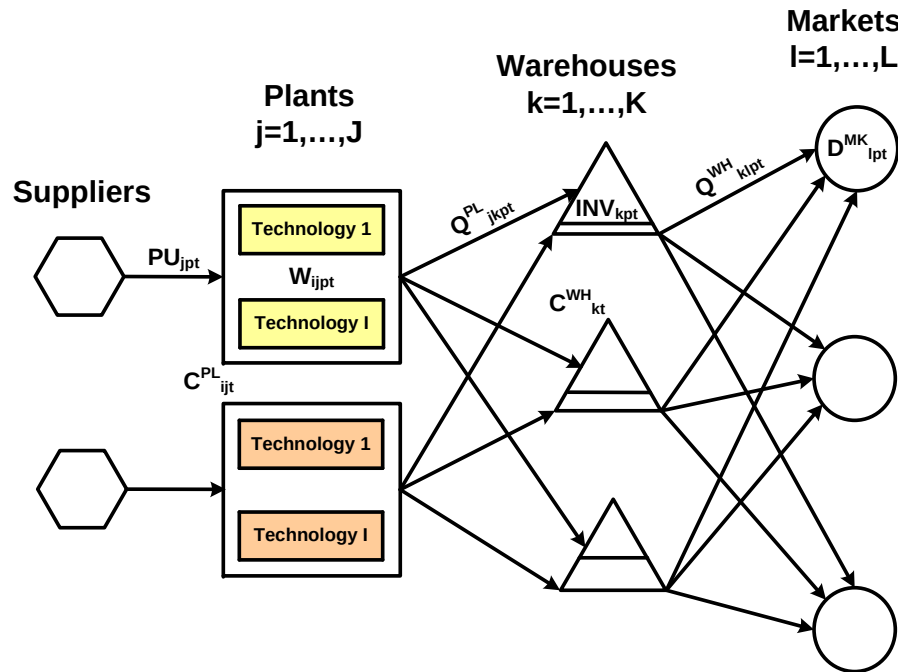
You, Grossmann (2009)



Optimal Planning of Sustainable Chemical Supply Chains

Guillen, Grossmann (2010)

Life Cycle Analysis



Bicriterion optimization

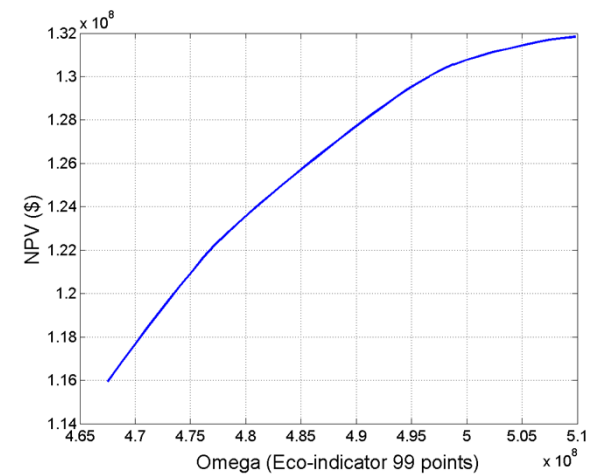
Max Net Present Value

Min Environmental Impact

Eco-Indicator 99 for LCA
(Health, Ecosystem, Resources)

Uncertainty in emissions

Pareto-Optimal Solutions



Parametric programming



Concluding Remarks

Major challenges in Process Systems Engineering

Product and Process Design
Energy and Sustainability
Enterprise-wide Optimization

+

Fundamentals of Process Systems Engineering

Modeling
Optimization
Process Synthesis
Process Operations
Process Control

Challenge for Process Systems community:

Communicate importance of area to rest of Chemical Engineering

Driven by Industrial Needs!!

Chemical Engineering Community needs recognize value of PSE



Remarks on Education

1. Need to keep core Chemical Engineering Knowledge
Need to emphasize fundamentals: **basis life-long learning**
2. Need to modernize curriculum and add flexibility
 - *Increase exposure molecular level*
 - *Increase exposure to energy (alternative/renewable) and sustainability issues*
 - *Expose students to new process technology*
 - *Introduce product design as complement of process design*
 - *Emphasize process operations, enterprise planning*
 - *Increase link to other industrial sectors (pharma, electronics)*
3. Need to recognize that “**bio-area**” will be important but not dominant force in Chemical Engineering; similarly “**nano area**”
4. Environmental Engineering increasingly important and requires chemical engineering (*water use efficiency, pollution control.*) **Civil Eng. ownership?**
5. Need **closer interaction with industry**; otherwise risk being irrelevant
6. Need to **provide excitement to recruit the very best young people** to join Chemical Engineering