



# **Cyber-MINLP: A virtual environment for problem formulations and algorithmic developments**

**Ignacio Grossmann, Pietro Belotti, Lorenz Biegler, Pedro Castro,  
Francois Margot, Juan Ruiz, Nikolaos Sahinidis, Andrew Grossmann**  
*Carnegie Mellon*

**Jonathan Lee, Andreas Waechter**  
*IBM*

*NSF OCI-0750826*

## General Goals of MINLP.org:

- Create a cyberinfrastructure environment for virtual collaboration for developing and collecting tools, and challenging MINLP test problems
- Develop basic algorithms, formulations for predicting tight lower bounds, and open-source software for solving large-scale nonconvex MINLP problems  
(e.g. Couenne software for global optimization)
- Test software with challenge problems arising in real-world applications, mostly in engineering but also in biology and finance

## Major component: **Library of MINLP problems**

### **Why if other MINLP Libraries?**

**GAMS World MINLP**

<http://www.gamsworld.org/minlp/index.htm>

**MacMINLP**

<http://www.mcs.anl.gov/~leyffer/macminlp/index.html>

**MINOPT Model Library**

<http://titan.princeton.edu/MINOPT/library.html>

## Major emphasis: **problem formulation** **and collaborative environment**

- provide high level description of problems
- one or several model formulations with their corresponding input file
- support multiple authors
- provide discussion forum

### **Motivation:**

- Often several formulations for MINLP problem
- Current test problems are only input files
- Practitioners learn by example
- Promote reproducibility and discussion

## Functionality website:

- Author submits **problem** with model (s), instance(s), results
- Other authors or same author can submit alternative models or instances for that problem
- Discussion with wiki forum

A possible scenario:

**Version 1:** Author X submits problem statement, models A & B, instances, results  
(*may submit only problem statement*)

**Author Y finds a better model C**

**Version 2:** Author Y submits new model C, instances, results

Discussion between author X and Y

**Author X finds can solve larger problems with his model**

**Version 3:** Author X submits new instances, results for models A,B,C

# Library of Optimization Problems



Carnegie Mellon



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Problem Title	Primary Author	Date Submitted	Date Last Modified	Application	Sessions	Model Types
1 <a href="#">A Deterministic Security Constrained Unit Commitment Model</a>	Zondervan, Edwin	07/24/2009	10/06/2009 (Model Added)	Engineering	2	MINLP, MIQP
2 <a href="#">Close-Enough Vehicle Routing Problem</a>	Mennell, William	01/09/2010	01/09/2010 (Problem Added)	Routing	1	MINLP
3 <a href="#">Design of Telecommunication Networks with Shared Protection</a>	Belotti, Pietro	08/31/2009	08/31/2009 (Problem Added)	Engineering	1	MINLP, MILP
4 <a href="#">Extended Pooling Problem with the Summer Time (EPA) Complex Emissions Constraints</a>	Misener, Ruth	03/04/2010	03/04/2010 (Problem Added)	Engineering	1	MINLP
5 <a href="#">Global multi-objective optimization of a nonconvex MINLP problem and its application on polygeneration energy systems design</a>	Liu, Pei	07/30/2009	07/30/2009 (Problem Added)	Engineering	1	MINLP
6 <a href="#">MINLP &amp; MPCC Strategies for Optimization of a Class of Hybrid Dynamic Systems</a>	Baumrucker, Brian	05/21/2009	05/21/2009 (Problem Added)	Engineering	1	MINLP, NLP, MIQP
7 <a href="#">Mixed-Integer Nonlinear Programming Models and Algorithms for Supply Chain Design with Stochastic Inventory Management</a>	You, Fengqi	06/10/2009	06/10/2009 (Problem Added)	Operations	1	MINLP
8 <a href="#">Mixed-Integer Nonlinear Programming Models for Optimal Simultaneous Synthesis of Heat Exchangers Network</a>	Escobar, Marcelo	04/30/2010	04/30/2010 (Problem Added)	Engineering	1	MINLP
9 <a href="#">Mixed-Integer Nonlinear Programming Models for the Optimal Design of Multi-product Batch Plant</a>	You, Fengqi	08/18/2009	08/18/2009 (Problem Added)	Engineering	1	MINLP
10 <a href="#">MPEC strategies for optimization of pipeline operations</a>	Gopalakrishnan, Ajit	03/12/2010	03/12/2010 (Problem Added)	Engineering	1	NLP

## Library of Optimization Problems

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Problem Title	Primary Author	Date Submitted	Date Last Modified	Application	Sessions	Model Types
11 <a href="#">Optimal Scheduling of Refined Products Pipelines and Terminal Operations</a>	Cafaro, Diego	04/06/2010	04/06/2010 (Problem Added)	Operations	1	MILP
12 <a href="#">Optimal Separation Sequences Based on Distillation: From Conventional to Fully Thermally Coupled Systems</a>	Caballero, Jose	11/23/2009	11/23/2009 (Problem Added)	Engineering	1	MINLP
13 <a href="#">Optimization model for density modification based on single-crystal X-ray diffraction data</a>	Sahinidis, Nick	06/13/2009	06/13/2009 (Problem Added)	Physics	1	MINLP, MILP
14 <a href="#">Optimization of metabolic networks in biotechnology</a>	GUILLEN, GONZALO	02/19/2010	02/19/2010 (Problem Added)	Biology	1	MINLP
15 <a href="#">Periodic Scheduling of Continuous Multiproduct Plants</a>	Castro, Pedro	06/25/2009	06/25/2009 (Problem Added)	Engineering	1	MINLP
16 <a href="#">Simultaneous Cyclic Scheduling and Control of a Multiproduct CSTR</a>	Flores-Tlacuahuac, Antonio	12/24/2009	12/24/2009 (Problem Added)	Engineering	1	MINLP
17 <a href="#">Solving Mixed-Integer Linear Fractional Programming Problems with Dinkelbach's Algorithm and MINLP Methods</a>	You, Fengqi	08/11/2009	08/11/2009 (Problem Added)	Algorithm	1	MINLP
18 <a href="#">Stabilizing controller design and the Belgian chocolate problem</a>	Chang, YoungJung	09/26/2009	09/26/2009 (Problem Added)	Engineering	1	MINLP
19 <a href="#">Stochastic Portfolio Optimization with Round Lot Trading Constraints</a>	Lejeune, Miguel	10/02/2009	10/02/2009 (Problem Added)	Finance	1	MINLP
20 <a href="#">The Close-Enough Traveling Salesman Problem</a>	Mennell, William	11/15/2009	11/15/2009 (Problem Added)	Routing	1	MINLP

## Library of Optimization Problems

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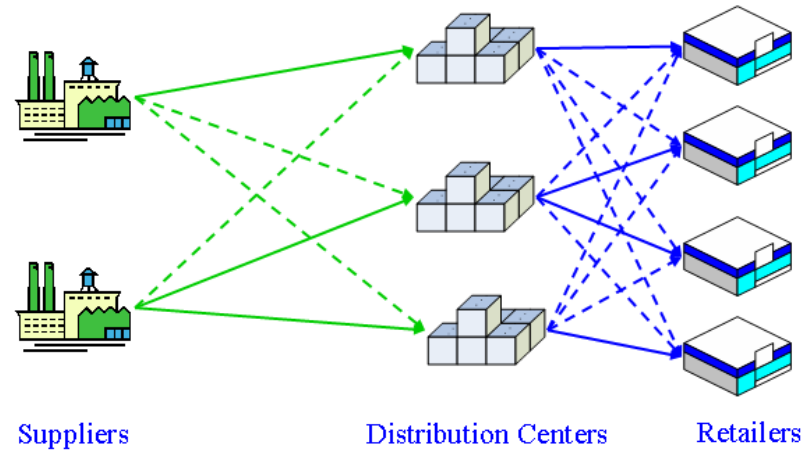
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	Problem Title	Primary Author	Date Submitted	Date Last Modified	Application	Sessions	Model Types
21	<a href="#">The Delay Constrained Routing Problem (DCRP)</a>	hijazi, hassan	11/10/2009	11/10/2009 (Problem Added)	Telecommunications	1	MINLP
22	<a href="#">Water Treatment Network Design</a>	Ruiz, Juan	05/15/2009	05/15/2009 (Problem Added)	Engineering	1	MINLP



# Supply Chain Design with Stochastic Inventory Management

*Fengqi You, Ignacio Grossmann*



## Determine:

- how many distribution centers to locate & where to locate them
- which retailers to assign to each distribution center (DC)
- how often to reorder for replenishment at each DC
- what level of safety stock to maintain

**Goal:** minimize the total location, transportation, and inventory costs while ensuring a specified service level  $\alpha$ .

## Model 1:

### Straightforward Model

Involves nonlinear 0-1 variables

$X_j$  and  $Y_{ij}$  declared as 0-1 variables

$$\text{Min: } \sum_{j \in J} f_j X_j + \beta \sum_{j \in J} \sum_{i \in I} \chi d_{ij} \mu_i Y_{ij} + \sum_{j \in J} X_j \left[ F_j n_j + \beta (g_j + a_j \frac{D_j}{n_j}) n_j + \theta \frac{h D_j}{2 n_j} \right] + \theta h z_\alpha \sum_{j \in J} \sqrt{\sum_{i \in I} L \sigma_i^2 Y_{ij}}$$

**Linear in X and Y**
**Bilinear in X and n**
**Nonlinear in Y**  
**linear fractional in D and n**

$$\text{s.t. } \sum_{j \in J} Y_{ij} = 1, \quad \forall i \in I$$

$$Y_{ij} \leq X_j, \quad \forall i \in I, \forall j \in J$$

$$D_j = \sum_{i \in I} \chi \mu_i Y_{ij}, \quad \forall j \in J$$

$$X_j \in \{0,1\}, \quad \forall j \in J$$

$$Y_{ij} \in \{0,1\}, \quad \forall i \in I, \forall j \in J$$

$$D_j \geq 0, n_j \geq 1, \quad \forall j \in J$$

## Model 2:

### “Sophisticated” Model

Linear 0-1 variables

Only  $X_j$  declared as 0-1 variables;  $Y_{ij}$  as **continuous**

$$\text{Min: } \sum_{j \in J} (f_j X_j + \sum_{i \in I} \hat{d}_{ij} Y_{ij} + K_j Z1_j + q Z2_j) \quad \text{Linear}$$

$$\text{s.t. } \sum Y_{ij} = 1, \quad \forall i \in I.$$

$$Y_{ij} \leq X_j, \quad \forall i \in I, \forall j \in J.$$

Concave in Z

$$-Z1_j^2 + \sum \mu_i Y_{ij} \leq 0, \quad \forall j \in J$$

$$-Z2_j^2 + \sum_{i \in I} \hat{\sigma}_i^2 Y_{ij} \leq 0, \quad \forall j \in J$$

$$X_j \in \{0,1\}, \quad \forall j \in J$$

$$0 \leq Y_{ij} \leq 1, \quad \forall i \in I, \forall j \in J.$$

$$Z1_j \leq \sqrt{\sum_{i \in I} \mu_i}, \quad \forall j \in J$$

$$Z2_j \leq \sqrt{\sum_{i \in I} \hat{\sigma}_i^2}, \quad \forall j \in J$$

$$Z1_j \geq 0, Z2_j \geq 0, \quad \forall j \in J$$

where

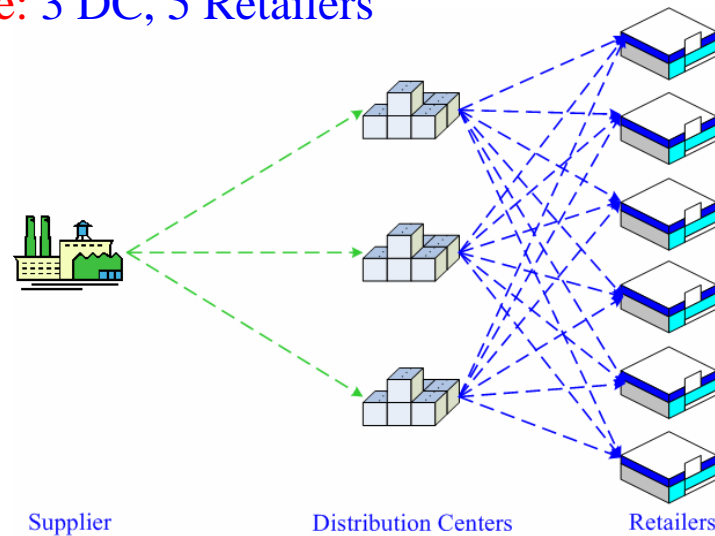
$$\hat{d}_{ij} = \beta \chi \mu_i (d_{ij} + a_j)$$

$$K_j = \sqrt{2\theta h \chi (F_j + \beta g_j)}$$

$$q = \theta h z_\alpha$$

$$\hat{\sigma}_i^2 = L \sigma_i^2$$

Small instance: 3 DC, 5 Retailers



### Solution with BARON

Transportation cost ( $\beta$ )	Inventory cost ( $\theta$ )	Model (P1)		Model (P2)	
		Obj. Fun	CPU (s)	Obj. Fun	CPU (s)
0.01	0.01	2260.26	7.940	2260.26	0.470
0.1	0.01	8122.93	28.610	8122.93	0.120
0.001	0.01	1099.25	2.720	1099.25	0.200
0.01	0.1	5359.18	9.300	5359.18	0.440
0.01	0.001	1341.04	7.450	1341.04	0.140

=> Model 2 solves much faster

## Model 2 gets solved in root node!

Transportation cost weight factor ( $\beta$ )	Inventory cost weight factor ( $\theta$ )	Model (P1)		Model (P2)	
		NLP Relaxation	# of Node	NLP Relaxation	# Nodes
0.01	0.01	2195.53	713	2260.26	1
0.1	0.01	8122.93	1162	8122.93	1
0.001	0.01	879.11	269	1099.25	1
0.01	0.1	5027.08	54	5359.18	1
0.01	0.001	1338.95	61	1341.04	1

## Features in other problems

### Optimal Periodic Scheduling of Continuous Multiproduct Plants

*Pedro M. Castro, Augusto Q. Novais*

*Linear fractional objective: **not solvable** with any of standard codes  
(DICOPT, SBB,  $\alpha$ -ECP, BARON)*

### MINLP and MPCC Strategies for Optimization of Hybrid Dynamic Systems

*Brian Baumrucker, Larry Biegler*

*MPCC (continuous nonconvex NLP) **much faster** than MINLP model*

## Water Treatment Process Design Problem

*Juan Pablo Ruiz, Ignacio Grossmann*

*Alternative models: (flow, composition), (individual flows, split fractions)*

*-Both cannot solved with proper lower, upper bounds on variables*

*-Flow, composition leads to fewer nodes*

## Optimization model for density modification based on single-crystal X-ray diffraction data

*Alexander Smith, Nikolaos Sahinidis*

*Alternative models: MINLP and two MILPs (both huge in size)*

*None has been solved to optimality*

## Conclusions

### 1. Proposed cyberinfrastructure: **library of problems**

- **Emphasis is on model formulation**

*Especially useful for practitioners who want to learn  
how to formulate problems*

- **Supports multiple authors**

### 2. Site [www.minlp.org](http://www.minlp.org) is a source for:

- **Discussion forum about MINLP problems**

- **Problems for research and teaching courses**

### 3. Cybersite also has section on resources

*Lectures, other libraries, solvers, modeling systems, bibliography, conferences*