

# GLOBAL OPTIMIZATION FOR REAL-TIME OPERATIONS OF AN INDUSTRIAL GAS NETWORK

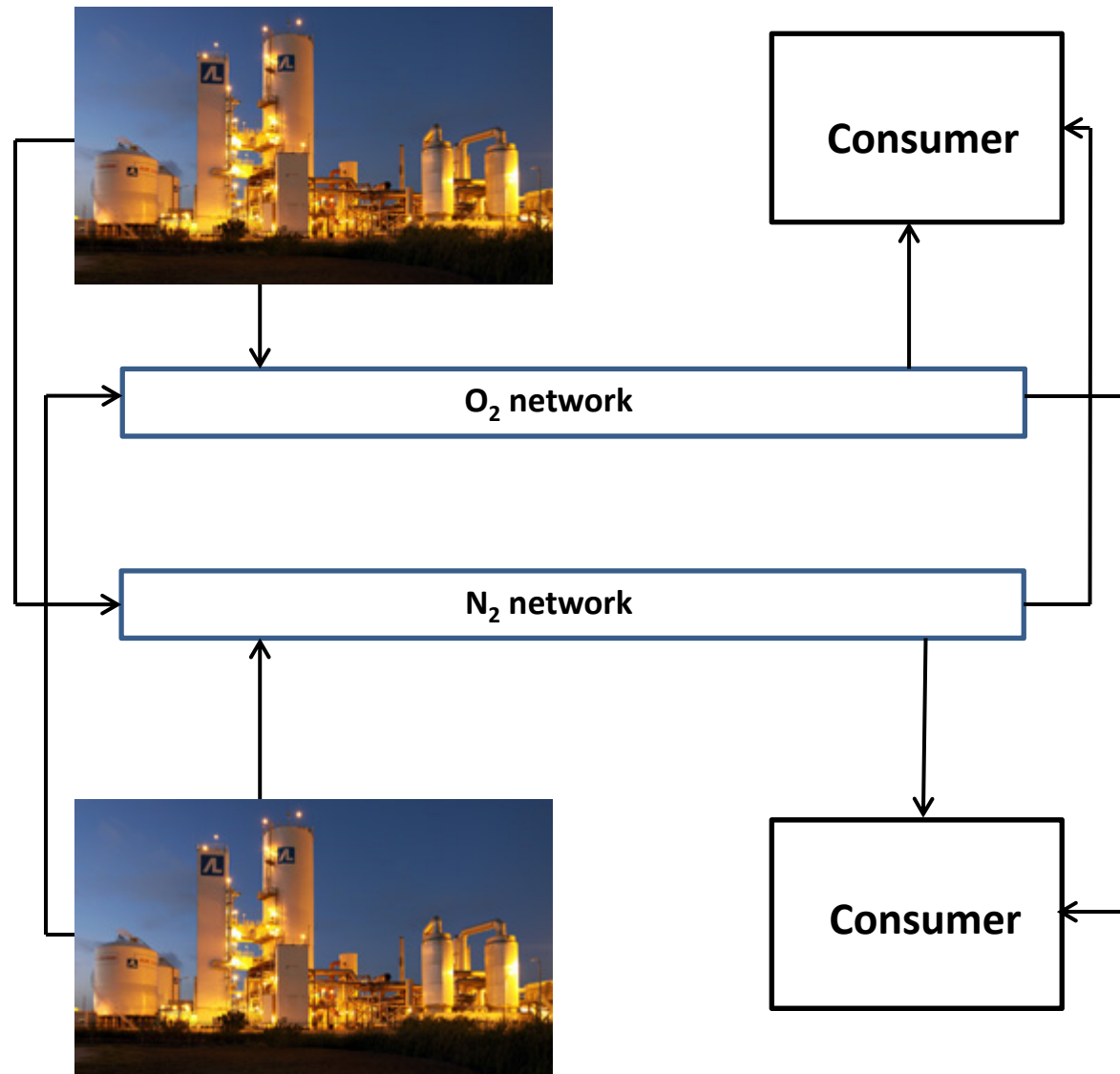
Yash Puranik and Nick Sahinidis (CMU)

Tong Li, Ajit Gopalakrishnan and Brian Besancon (Air Liquide)



# GAS PIPELINE NETWORKS

Pre-existing network of gas pipelines connecting air separation units and consumers



# SCOPE OF CURRENT WORK

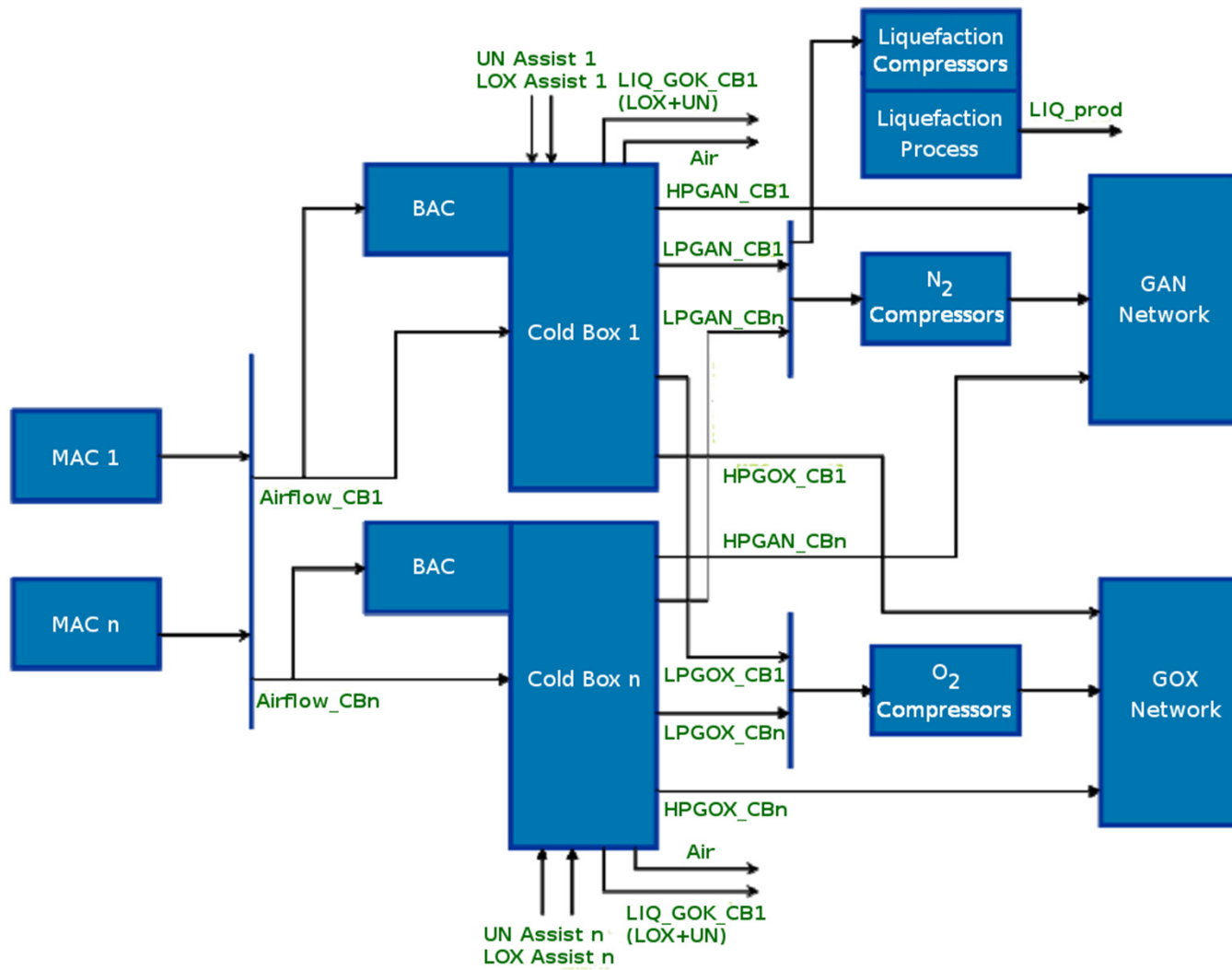
- **Consider operation of a network of 4 plants, 3 pipelines, and external sources**
- **Optimize operations under changing demands and fluctuating electricity prices**
- **Ensure small solution times for application as a real time optimizing tool**
  - **Select and tune solvers**
  - **Reformulate the model to be friendlier to solvers**
  - **Simplify the model if necessary to account for important interactions while maintaining reasonable complexity**

# ASSUMPTIONS OF THE MODEL

- **Consider operation for a single time period**
  - Implemented on a rolling horizon basis
- **All demands are necessarily satisfied**
- **Demands and electricity prices revealed at start of the period**
- **Instantaneous switching between states**

**Previous experience at Air Liquide shows presence of multiple local minima. Global optimization techniques essential**

# GENERIC PLANT DIAGRAM



# NETWORK MODEL

- **Model for a single column with 40 trays had size 320 differential equations, 1200 algebraic equations (Huang et al., 2013)**
- **Regression based models developed at Air Liquide**
- **Nonconvex models necessary to capture system characteristics**
- **Logic conditions**
  - **Conjunctions – Certain equipment must be used in concert**
  - **Disjunctions – Certain equipment cannot be used together**
  - **Reformulations with binary variables**
- **Problem Size - ~150 binaries, ~600 continuous variables, ~800 equations**

# MODEL CHALLENGES

- **Infeasibility:** combining different submodels led to feasibility issues not easily diagnosed
- **Numerics:** regression models contained very small ( $10^{-31}$ ) as well as very large numbers ( $10^{20}$ )
- **Nonconvexity:** global optimization techniques necessary to ensure we are not trapped by suboptimal solutions
- **Combinatorics:** presence of integrality restrictions in the model

# SIGNIFICANT CONTRIBUTIONS

- **Infeasibility**
  - Irreducible Inconsistent Set identification to help speed up diagnosis process for infeasible models
  - Novel preprocessing algorithm along with four other filtering algorithms implemented in the IIS isolation module in BARON
- **Numerics**
  - Model simplification through reformulations and scaling
- **Combinatorics:**
  - Solution of MILP relaxations in BARON for stronger lower bounds
  - Coefficient reduction, strong branching, cutting planes...



# RESULTS

Tests run over 6 different scenarios of demands and other input parameters.  
Tests were run with an optimality tolerance of 5% and time limit of 3600 seconds

Solver	# of failures/ no solution	# of infeasibility claims	# of times converged within tolerance	Average computation time
Antigone	-	6	-	1
AlphaECP	6	-	-	3600
Lindoglobal	1	-	-	3600
Scip	1	-	-	942
Couenne	1	-	-	3600
SBB	-	6	-	1
DICOPT	-	6	-	1
<b>BARON 14.3</b>	-	-	<b>6</b>	<b>105</b>

# CONCLUSIONS

- **Developed an optimization model for the operation of a gas pipeline network**
- **Can quickly and reliably solve the model for multiple scenarios**
- **Impact for other industrial applications through BARON**
  - IIS isolation automates model diagnosis
  - Model reduction and dynamic scaling strategy allows for robust and reliable solutions for regression models frequent in industrial applications
  - MIP relaxations allow faster solutions for difficult nonconvex MINLPs