



# Transient Simulation and Optimization of Natural Gas Pipeline Operation and Applications to Gas-Electric Coordination

Presented at the FERC Technical Conference: Increasing Real-Time and Day-Ahead Market Efficiency through Improved Software

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## Project Team



## Technical Expertise



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- About GECO, Project Team
- Gas System Optimizer (GSO) – software for transient pipeline network optimization
- Model benchmarking to SCADA data
- Numerical experiments to
  - estimate the value of transient optimization
  - estimate the potential value of the Gas Balancing Market
- Conclusions

- Formal Project Title: *Coordinated Operation of Electric And Natural Gas Supply Networks: Optimization Processes And Market Design*
- Leading Organization: Newton Energy Group LLC
- ARPA-E Program: OPEN-2015
- Project started: April 20, 2016
- Project term: 2 years through April 19, 2018. Extended through October 2018
- ARPA-E project summary: <https://arpa-e.energy.gov/?q=slick-sheet-project/gas-electric-co-optimization>

# GECO Objectives and Program Elements

**Objectives:** algorithms, software and an associated market design to dramatically improve coordination and / or co-optimization of natural gas and electric physical systems and wholesale markets on a day-ahead and intra-day basis

## Program Elements

### Software & Algorithms



- Modules for pipeline simulations and optimization
- PSO SCUC/SCED for electric system simulation
- Data, cloud-based system simulating gas - electric interactions

### Market Design








- Joint gas-electric theory and computation methods of granular prices consistent with the physics of operations
- Market design proposal including coordination mechanisms using granular prices

### Realistic Market Simulations



- Gas-electric simulation model using realistic data
- Simulated scenarios comparing performance of gas-electric coordination policies under different assumptions

# GECO Project Team and Technical Expertise

Institution	Expertise
	<ul style="list-style-type: none"><li>• <b>ENELYTIX®</b> Cloud platform for parallel modeling and analytics of energy systems and markets</li><li>• Optimal dynamic pricing and market design</li><li>• Commercialization</li></ul>
	<ul style="list-style-type: none"><li>• Advanced computational methods and algorithms for simulation and optimization of gas &amp; electric networks</li></ul>
	<ul style="list-style-type: none"><li>• PSO – an advanced power systems simulation engine within <b>ENELYTIX®</b></li><li>• Power systems optimization expertise</li></ul>
	<ul style="list-style-type: none"><li>• Market design, coordination algorithms</li></ul>
	<ul style="list-style-type: none"><li>• Modeling language, optimization</li></ul>

## External Technical Expertise



- Advancements in dynamic optimization of real-size pipeline network
- The concept of Locational Trade Value (LTV) of natural gas as Lagrange multipliers for nodal mass balance
- Introduced Gas Balancing Market (GBM) as a voluntary transparent intra-day mechanism for trading deviations from ratable nominations made day-ahead



# Gas System Optimizer (GSO)



# Gas System Optimizer (GSO)

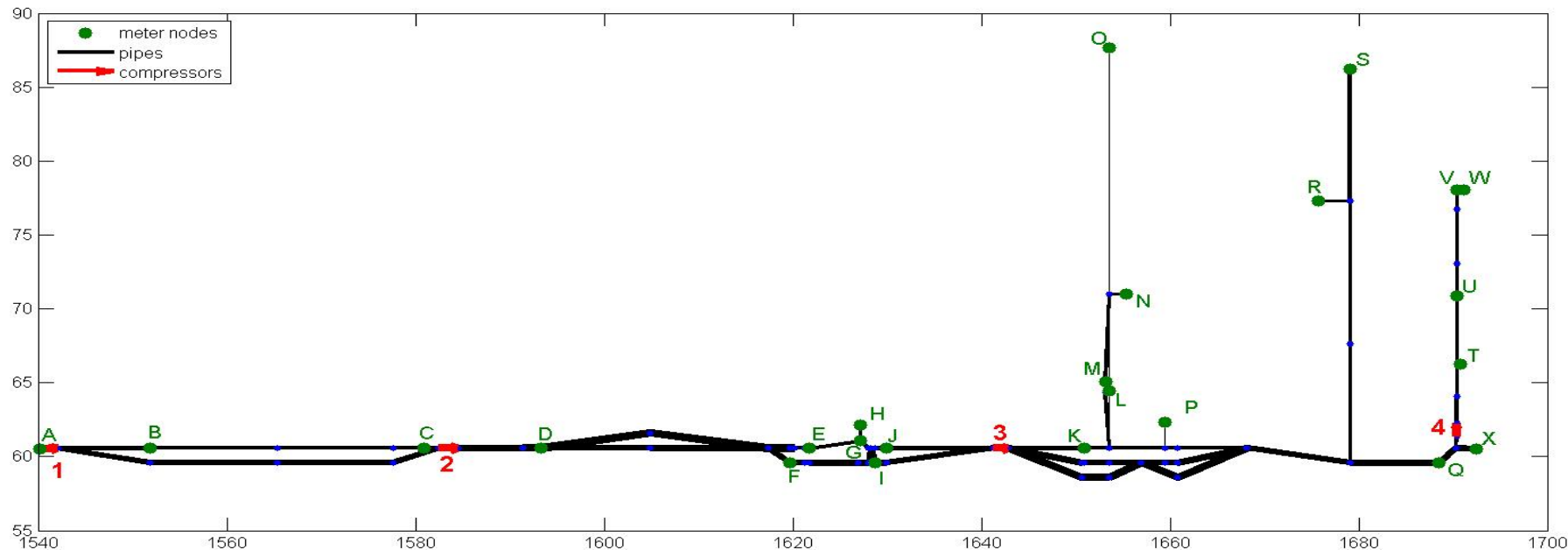
- Algorithms and Matlab code developed by LANL
- Problem formulation in the context of social welfare optimization – joint development of the GECO team
- User controlled linear objective function. In addition to maximizing social welfare can maximize throughput and other linear metrics
- Runs optimization using rolling horizon approach
- Primary focus is on intra-day details over one- to several days optimization horizon. User defined time step (multi-hour, hourly, sub-hourly)
- Integrated into **ENELYTIX®** cloud-based parallel computing system as PSO – GSO interaction process; implemented on Amazon EC2 cloud (GSO integration and development is being finalized)
- Could be used solely for pipeline network optimization as well as for modeling coordinated operation of natural gas pipeline system and electric networks
- GSO models, algorithms, key engineering constraints – see A. Zlotnik, M. Chertkov, and S. Backhaus, “Optimal control of transient flow in natural gas networks,” in 54th IEEE Conference on Decision and Control, Osaka, Japan, 2015, pp. 4563–4570



# Model Validation using real SCADA Data

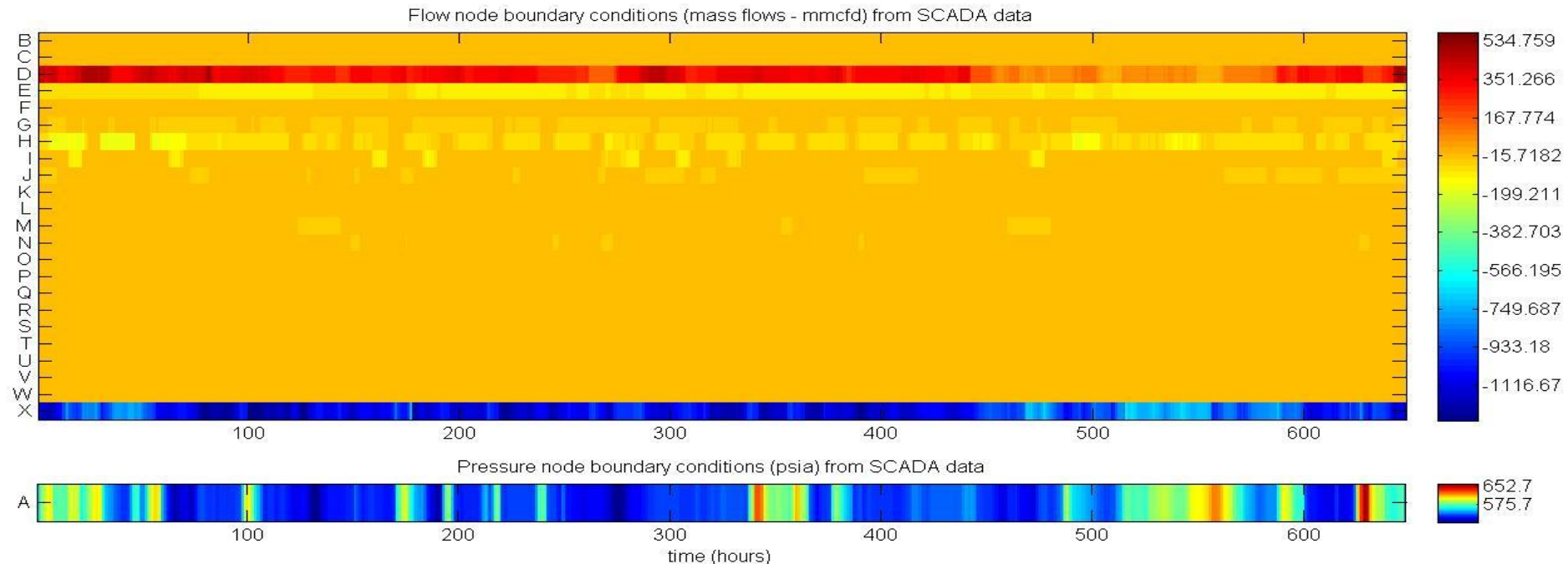
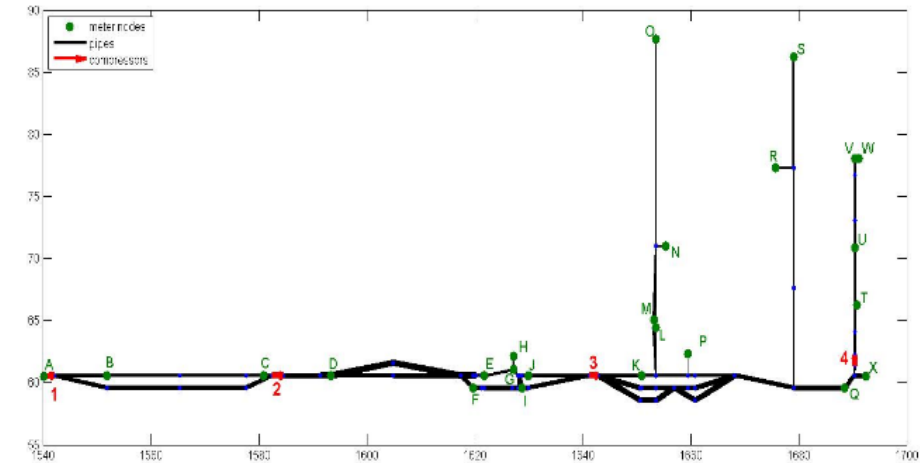
# Model Validation: Real Data

- Reduced model of subsystem:
  - 78 nodes, 91 pipes, 4 compressors (labelled 1 to 4)
  - 31 custody transfer meters at 24 locations (labelled A to X)
  - Flow nodes at B to X, pressure (slack) node at A
- Hourly SCADA flow, pressure and temperature data for February and March of 2014
- Segment serves 3 CCGT power plants



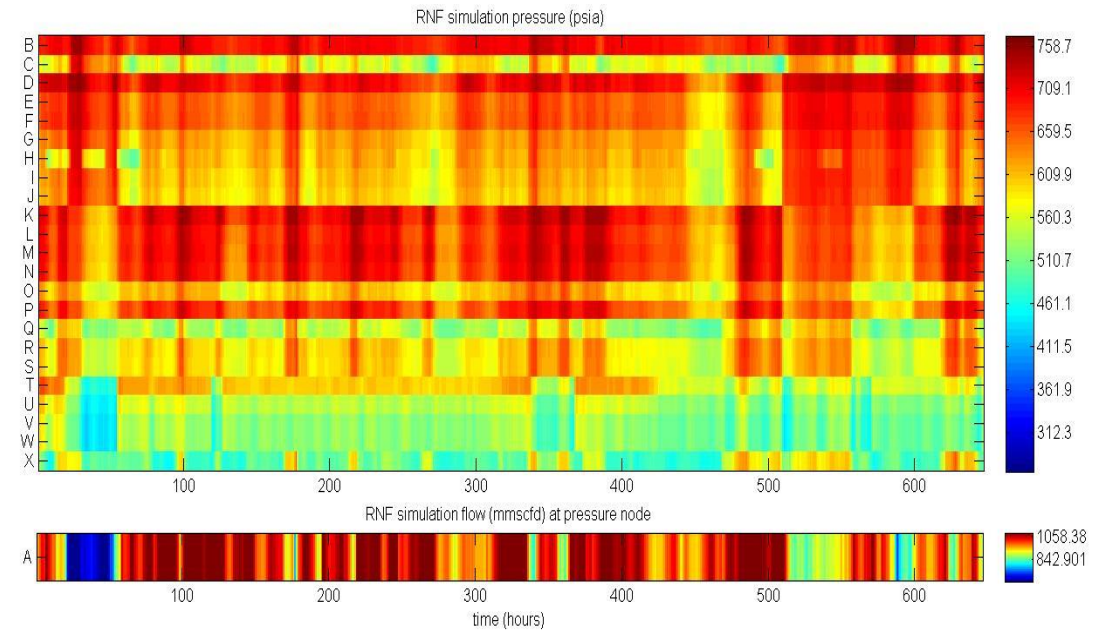
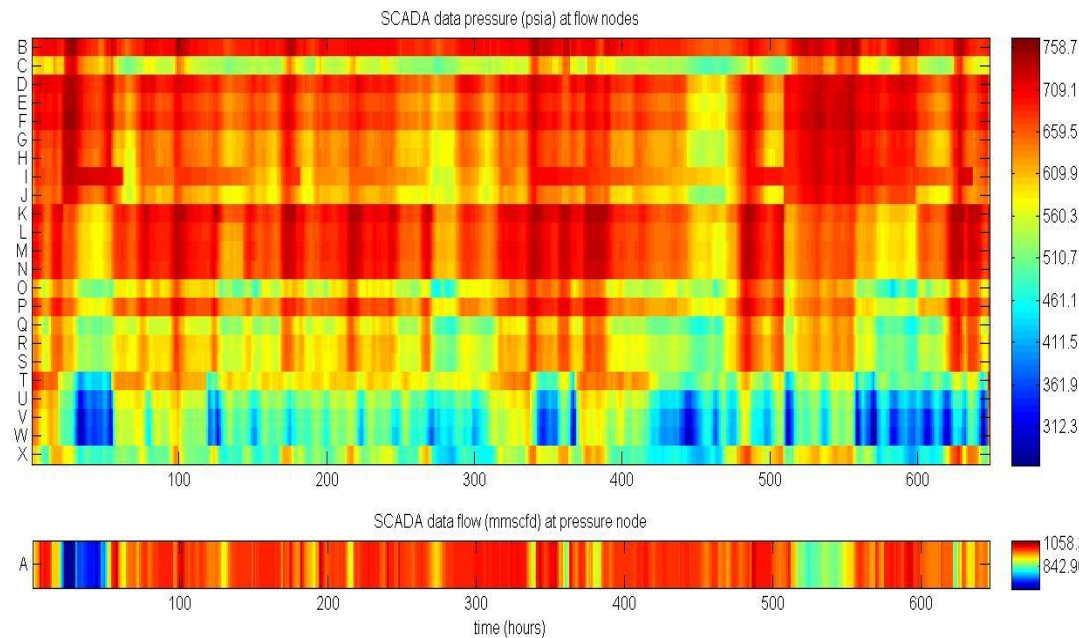
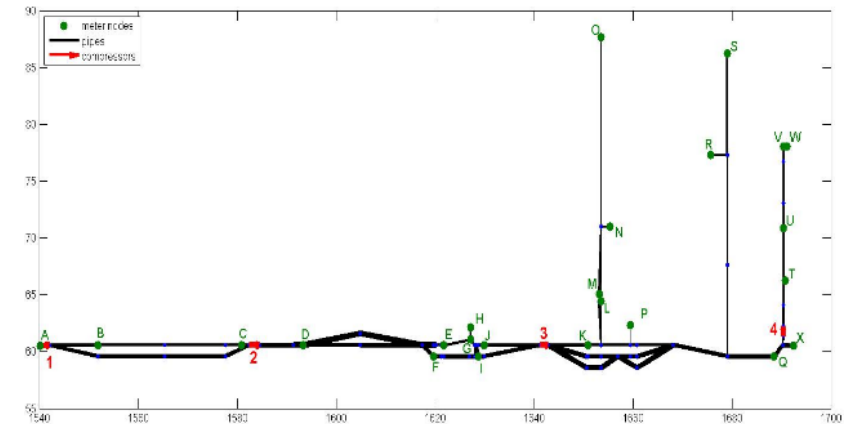
# Model Validation: Real Data

- Boundary conditions (from data):
  - Mass flow into system (injections) at flow nodes B to X
  - Pressure at slack node A



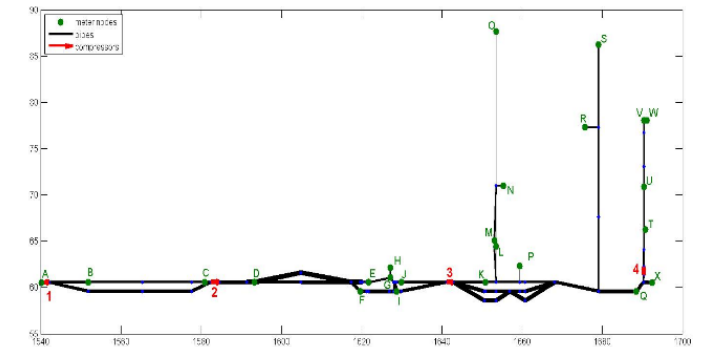
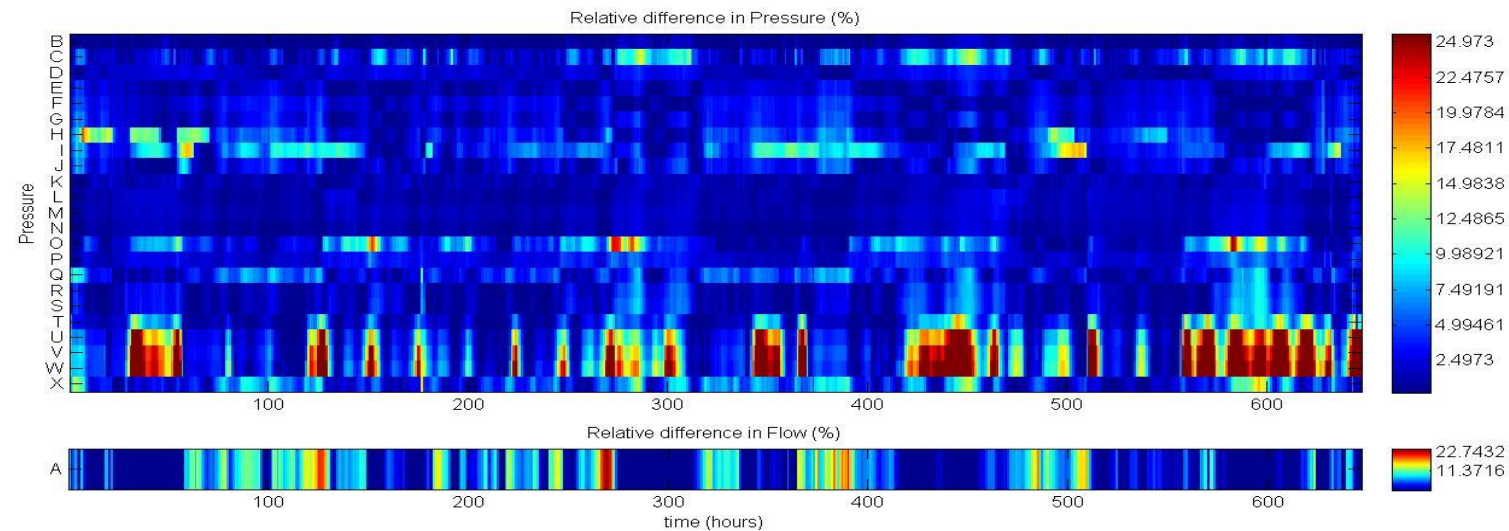
# Model Validation: Real Data

- Corresponding solution (Feb-2014 results shown)
  - Simulation using reduced model, and data
  - Pressure at flow nodes B to X
  - Mass flow into the system at slack node A



# Model Validation: Deviations from Real Data

- Comparison: relative distance (%)
  - Pressure at flow nodes B to X
  - Mass flow into system at slack node A



- **Top: Flow node pressures, mean: 4.17%, (2.94% w/o U,V,W)**
- **Bottom: Flow into Pressure node A. Mean (max) 2.45% (23.7%)**





# Numerical Experiments

## Four Optimization Experiments Conducted

### Base Case

#### **Matching actual deliveries**

Purpose: Benchmark the model. Set up optimization to match actual deliveries and benchmark compressor operations to historical data

### Optimized Case

#### **Maximizing throughput**

Purpose: Evaluate incremental throughput achievable via transient optimization. Compare to the Base Case

#### **Matching actual social welfare**

Purpose: Set up optimization to match actual deliveries valued at historical prices and compute Locational Trade Values (LTVs) of gas based on optimization. Compare LTVs to a relevant actual price index

#### **Maximizing social welfare**

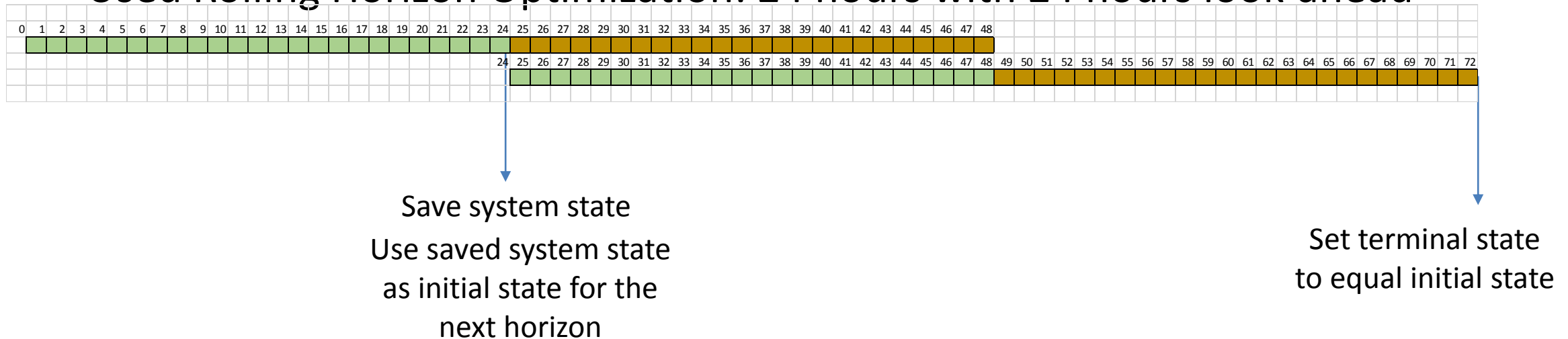
Purpose: Evaluate incremental throughput and social welfare achievable via transient optimization. Compare to the Base Case



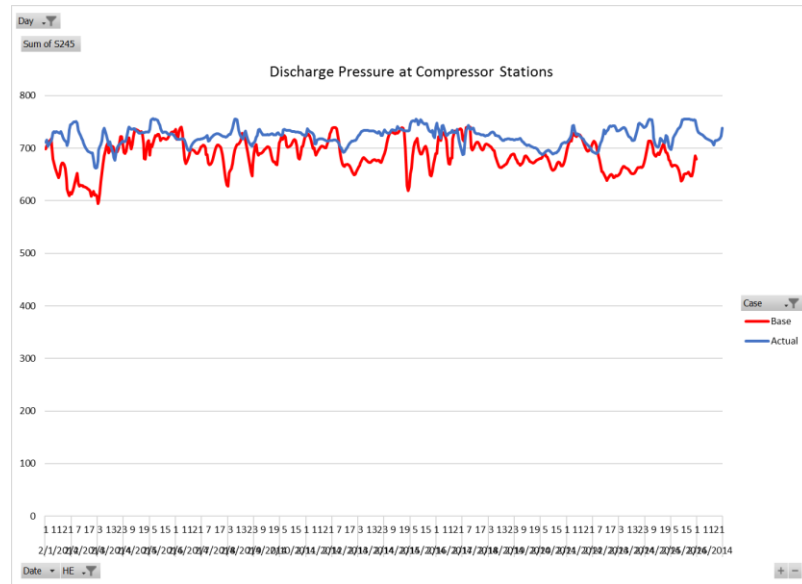
- All results are preliminary and subject to further validation and clarification
- Detailed results are shown for February 2014 only. March 2014 results are similar

# Benchmarking Optimization Results to Actual Data

- Model set-up
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - Controllable demand at exit point X is bounded at actual delivery
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral throughput (sum of deliveries)
- Used Rolling Horizon Optimization: 24 hours with 24 hours look-ahead



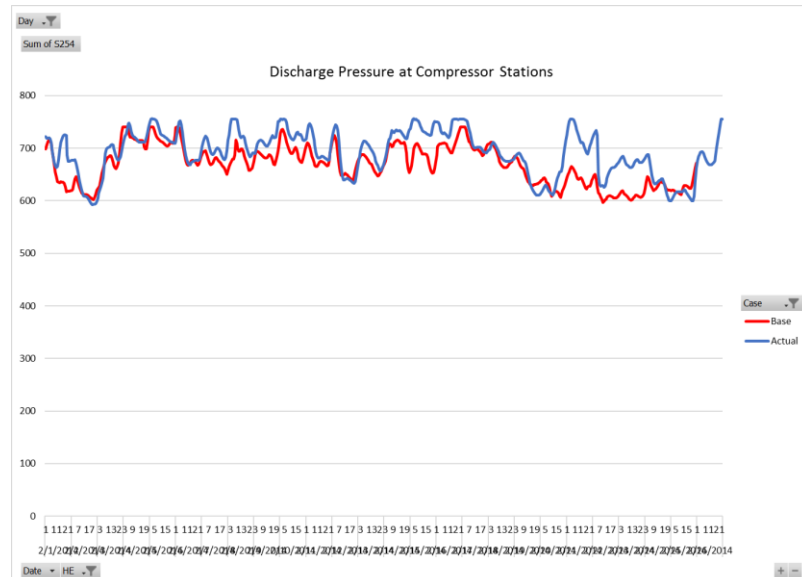
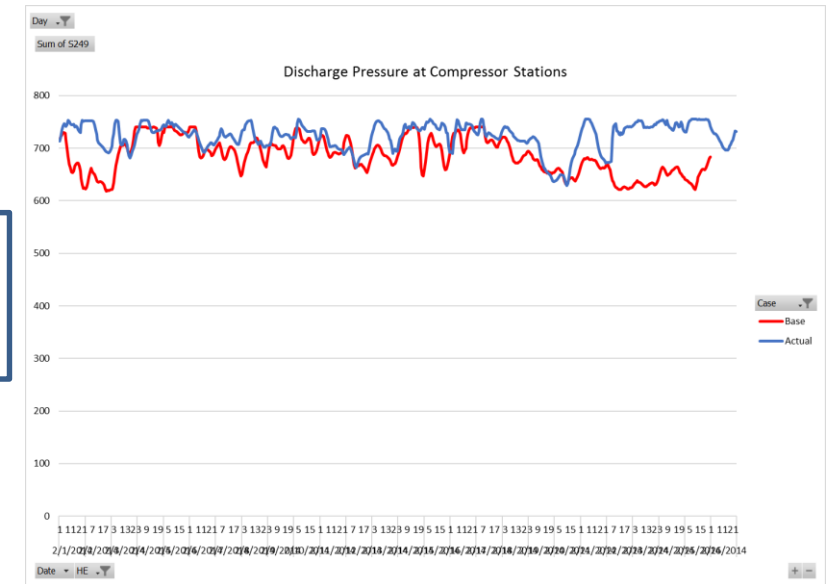
# Benchmarking Compressor Settings to Actual Data: February 2014



## February 2014 Discharge Pressure (psia) at Compressor Stations

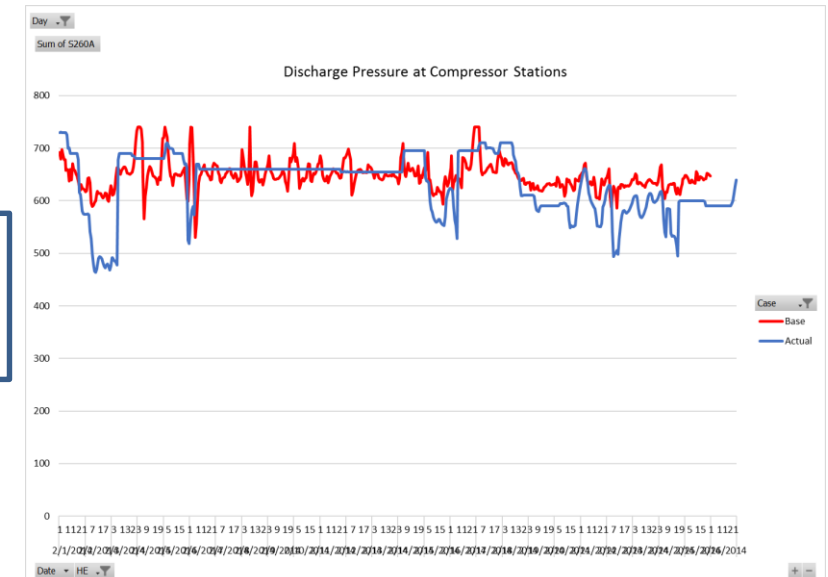
St. 1  
Base Case v.  
Actual

St. 2  
Base Case v.  
Actual



St. 3  
Base Case v.  
Actual

St. 4  
Base Case v.  
Actual



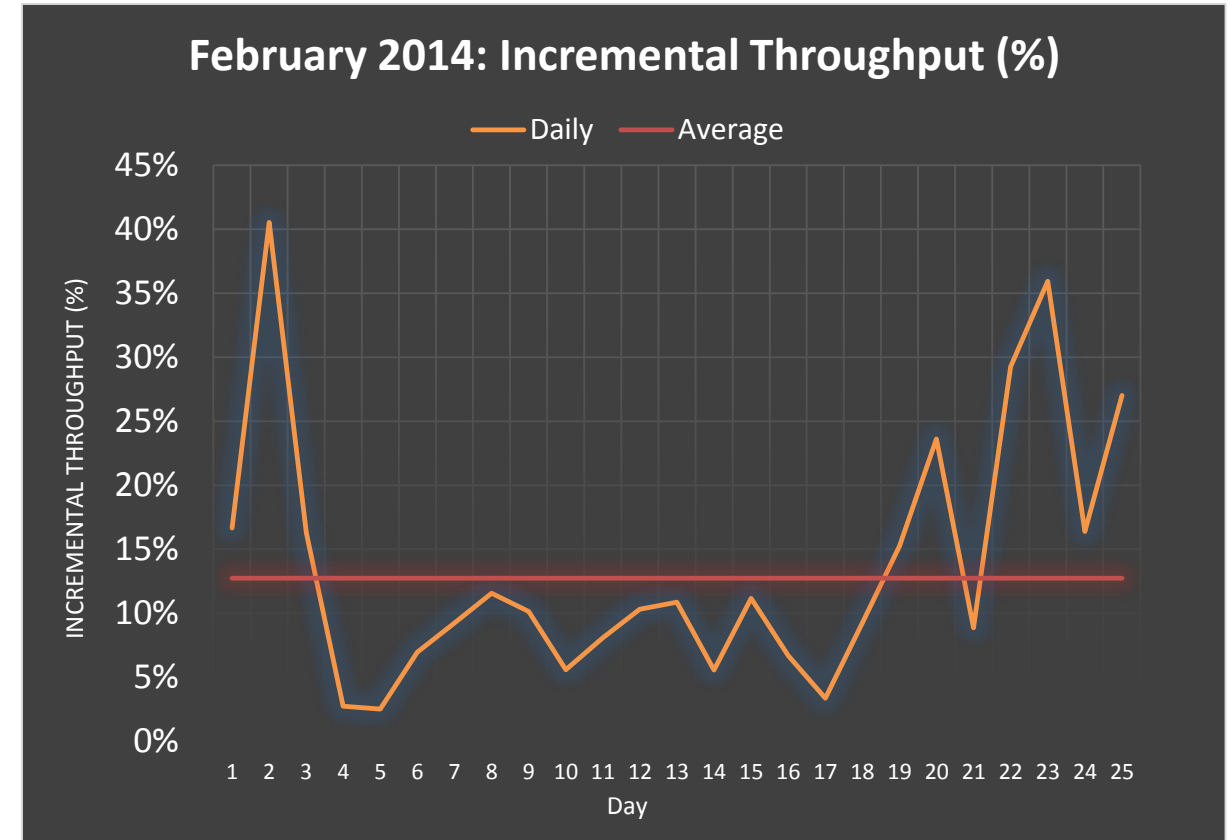
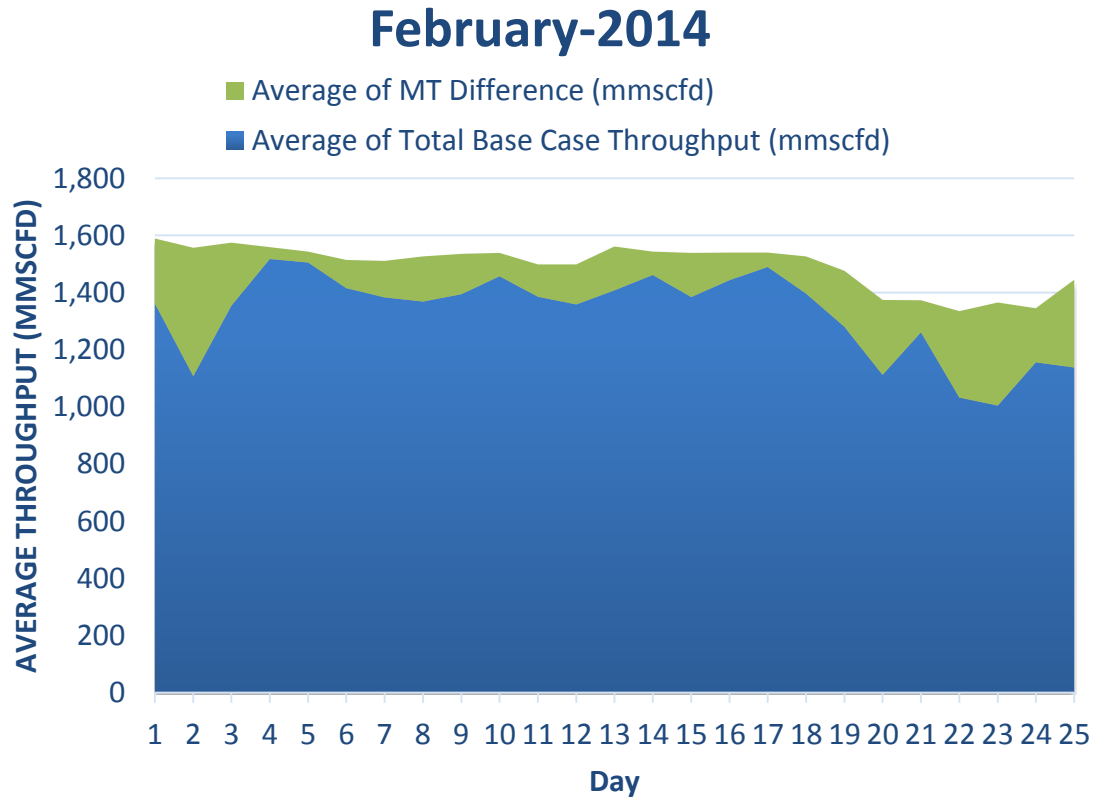
- Modeled compressor operations do not match actual data
  - Optimization model uses a number of simplifications
  - Exact limits on pressures and compressor capabilities are not known and are based on observation statistics
  - Actual operations do not follow transient optimization process
- However, compressor settings resulting from optimization simulations appear to be within a reasonable range of actual data

# Throughput Maximization

- Matching actual deliveries
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - Controllable demand at exit point X is bounded at actual delivery
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral throughput (sum of deliveries)
- Maximizing Throughput
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - **Controllable demand at exit point X is unbounded**
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral throughput (sum of deliveries)

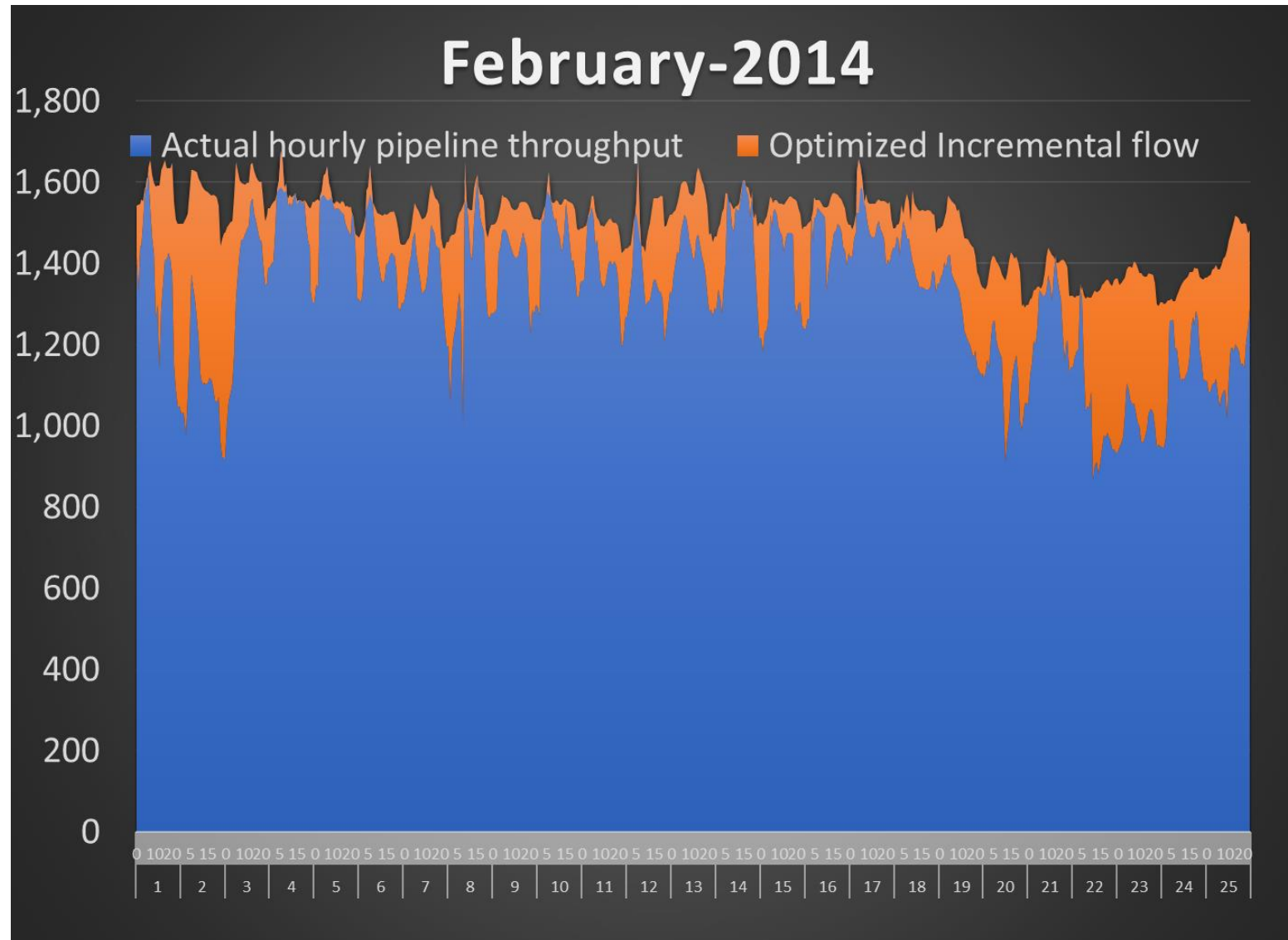
# Transient throughput optimization. February-2014

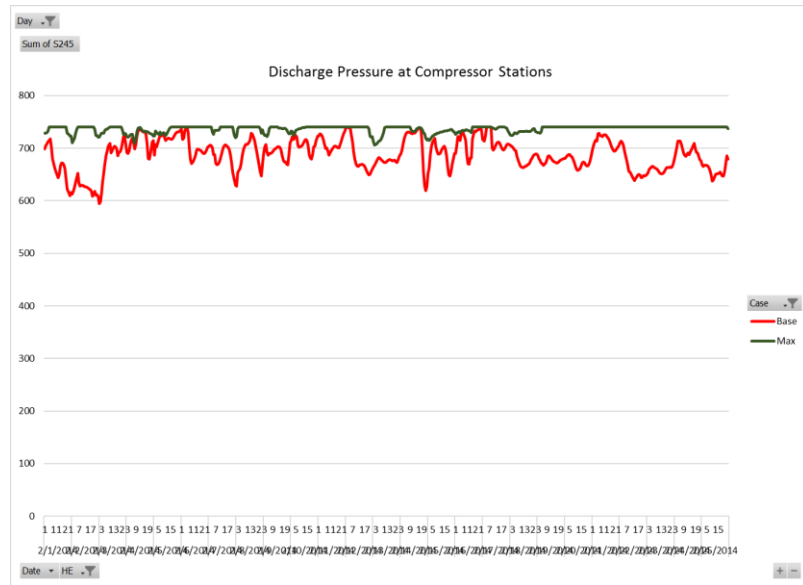
## Daily Results



# Transient throughput optimization. February-2014

## Hourly Results



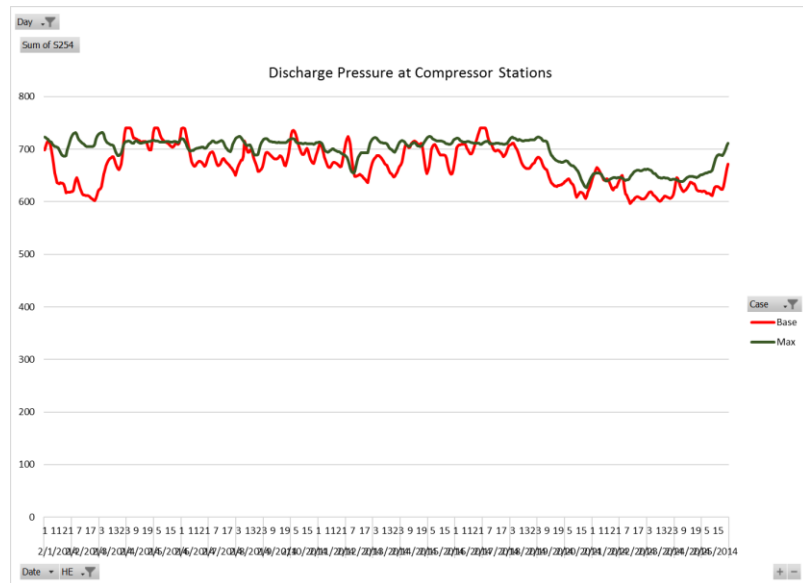
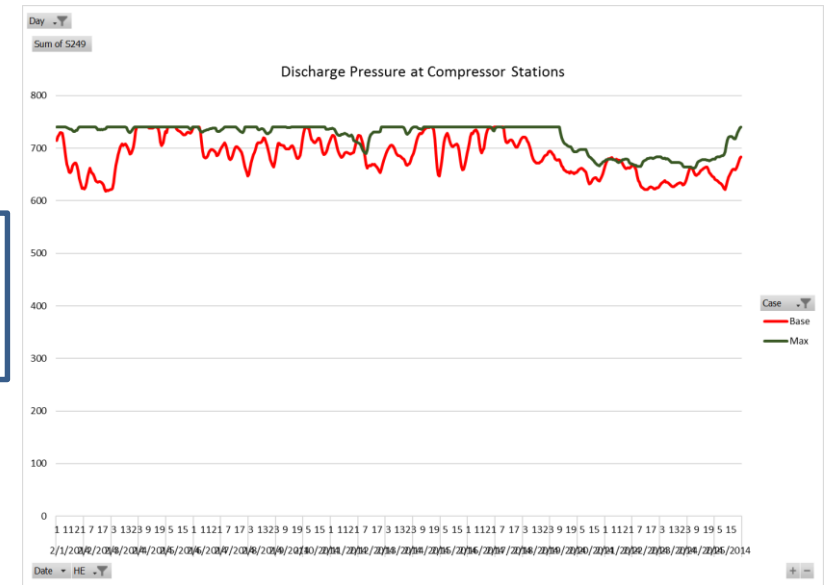


## February 2014

### Discharge Pressure (psia) at Compressor Stations

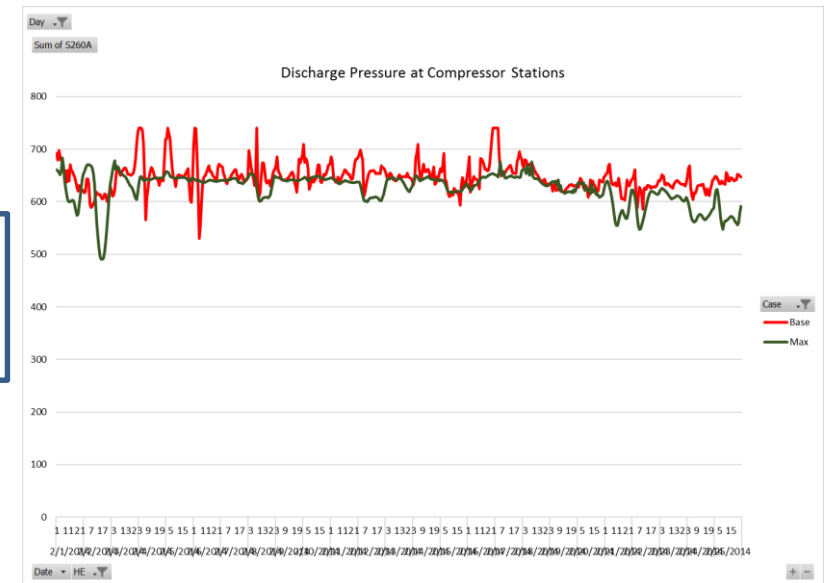
St. 1  
Base Case v.  
Max  
Throughput

St. 2  
Base Case v.  
Max  
Throughput



St. 3  
Base Case v.  
Max  
Throughput

St. 4  
Base Case v.  
Max  
Throughput





## Preliminary Findings from Throughput Maximization

- Transient optimization could increase the throughput by 12% - 14 % on average during the constrained time – Polar Vortex Period of February – March 2014
- That incremental throughput is unevenly spread in time
- It is possible however that larger increase in delivery is achieved at times when pipeline was not constrained and therefore the real effect of transient optimization could be smaller
- A more relevant metric would be to assess the increase in throughput “at time of need”

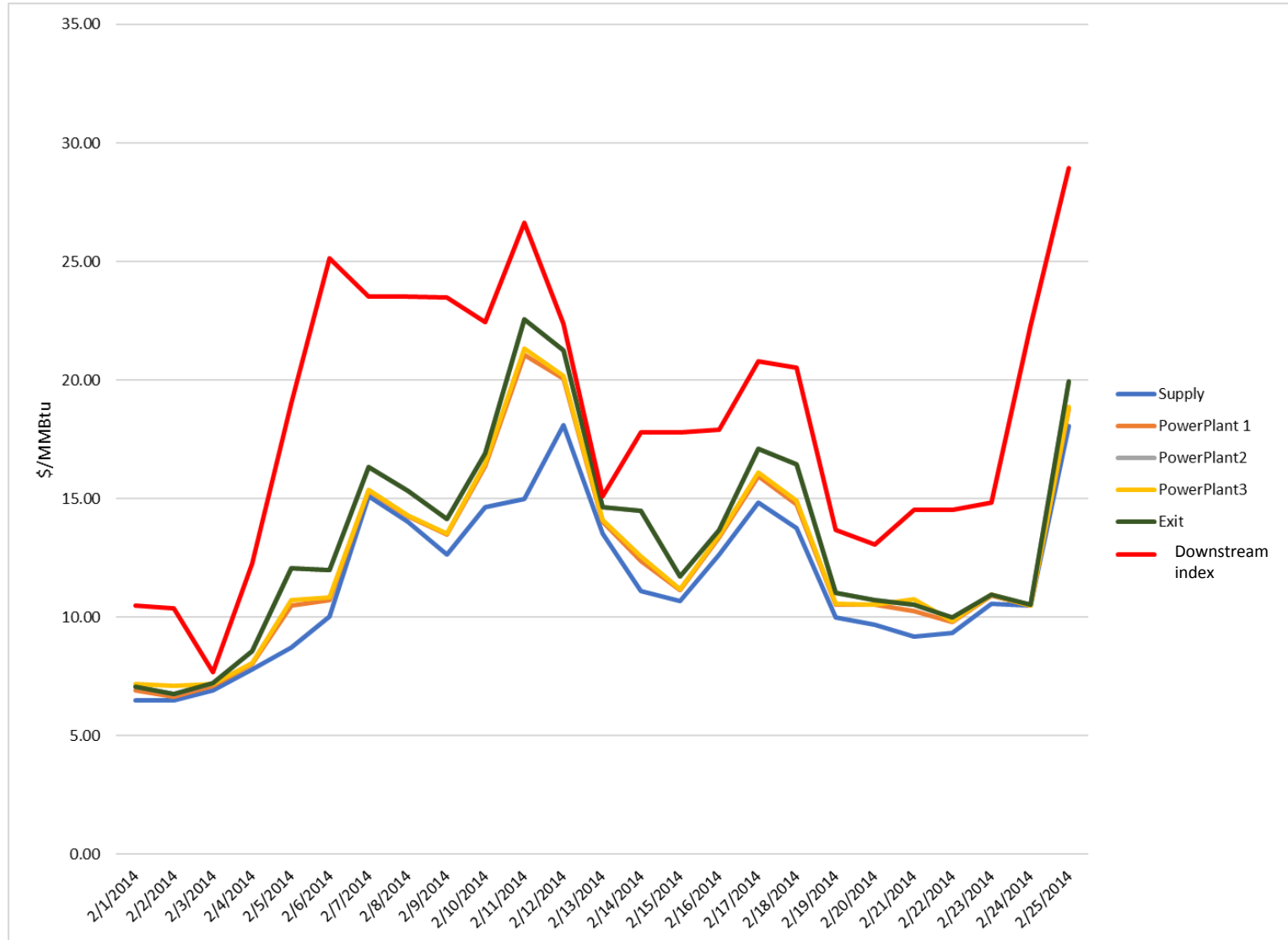
# Use of Historical Prices to Measure the Need

- Supply's offers are priced using daily upstream price index
- Actual demand's willingness to pay is priced at daily downstream price index for all delivery points except power plants
- Power plant's willingness to pay is priced hourly at  $LMP/HeatRate$  using plant specific LMPs and heat rates
- Incremental downstream demand is priced at  $HubLMP/8.5$  using relevant electricity market hub
- These prices are used to compute Social Welfare as a market surplus for the pipeline segment in question

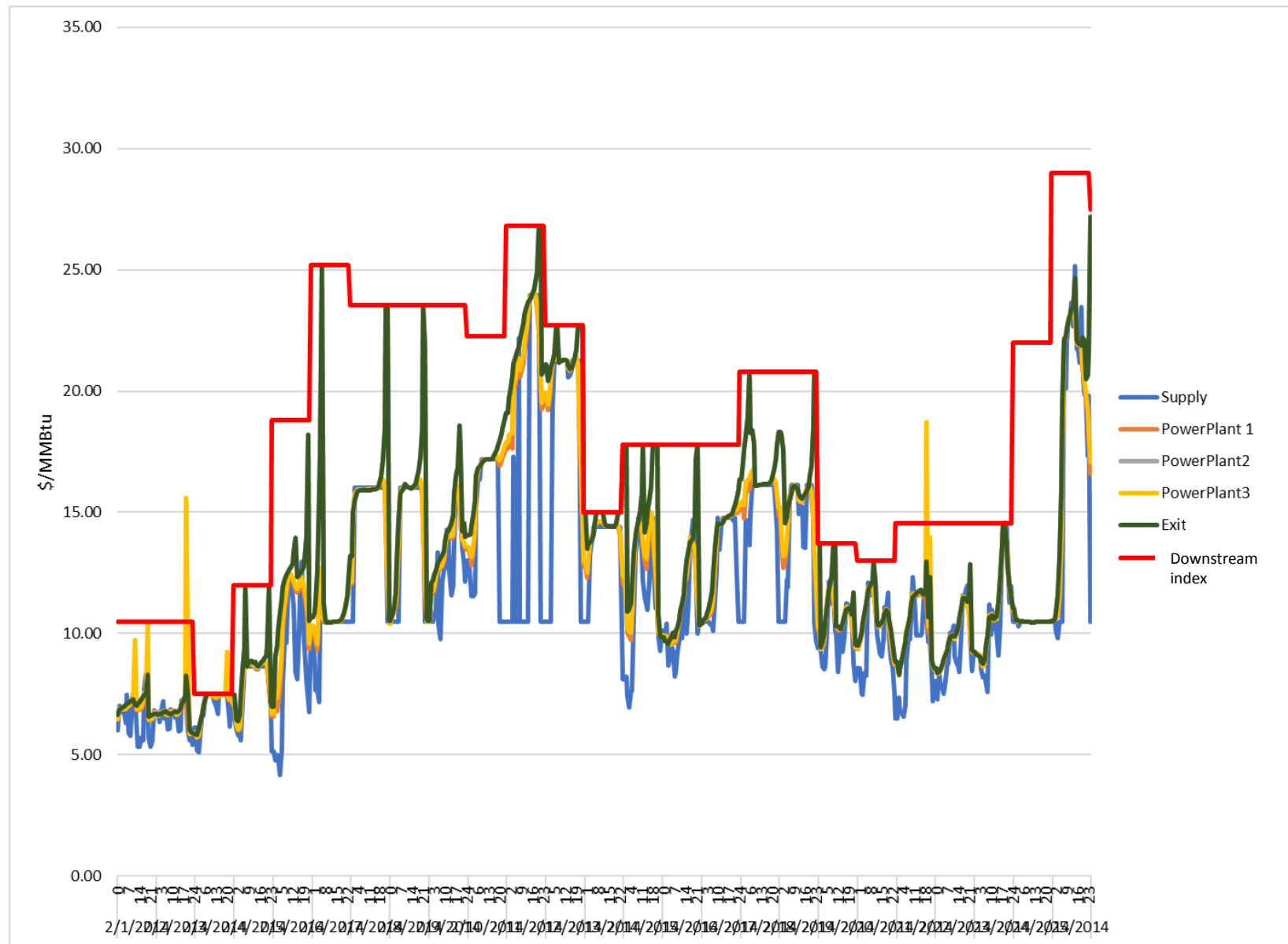
# Benchmarking the Base Case to Historical Prices

- Matching actual throughput
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - Controllable demand at exit point X is bounded at actual delivery
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral throughput (sum of deliveries minus sum of supplies)
- Matching actual social welfare
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - Controllable demand at exit point X is bounded at actual delivery
  - All pressure and compressor constraints apply
  - **Objective Function: maximize integral social welfare (summed over time total market surplus between buyers and sellers)**

# Daily LTVs compared to downstream index



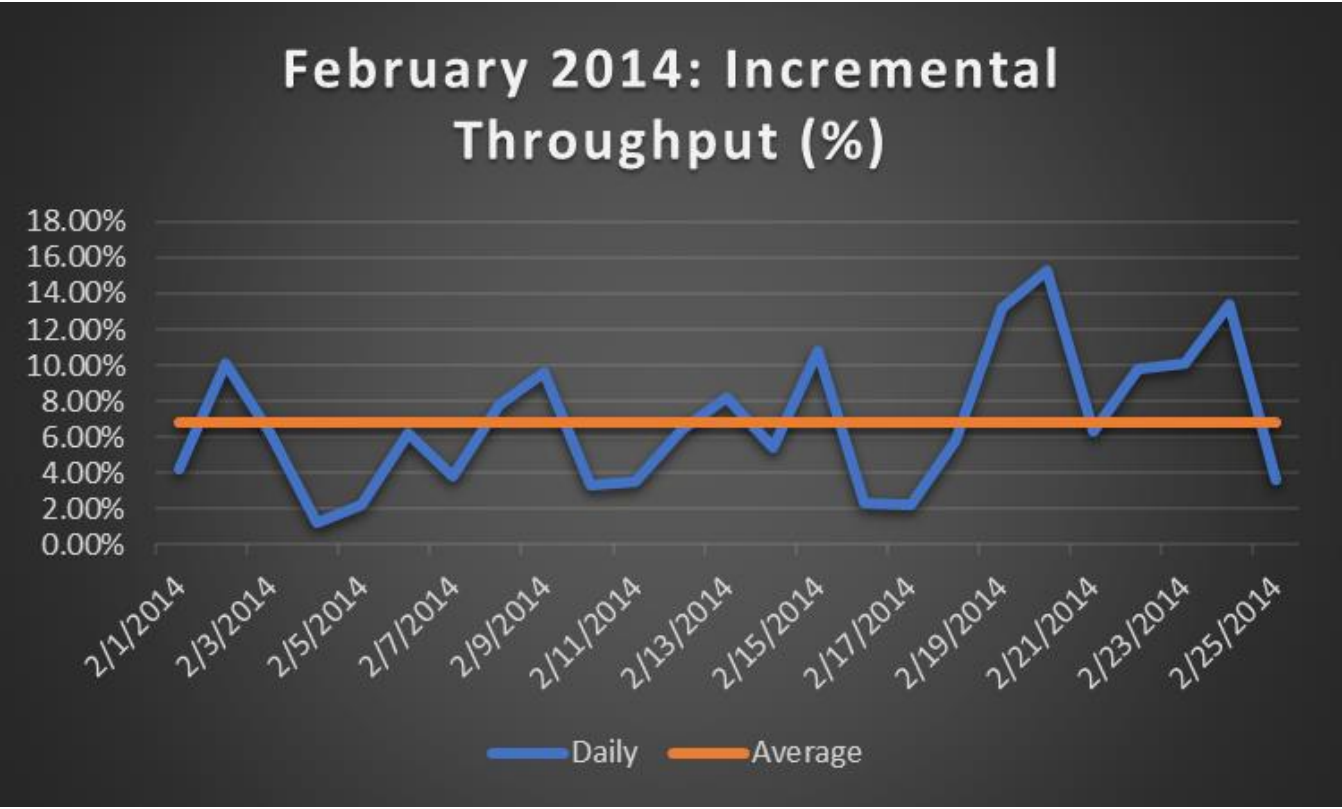
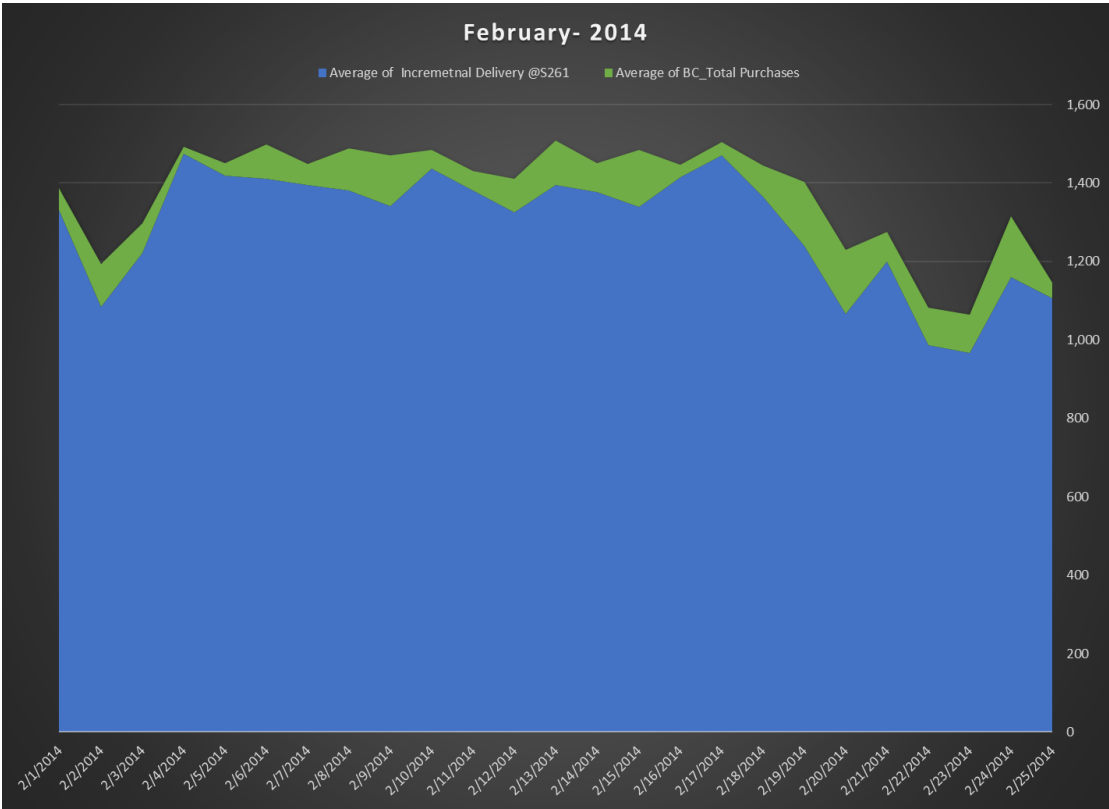
# Hourly LTV comparison to daily downstream index



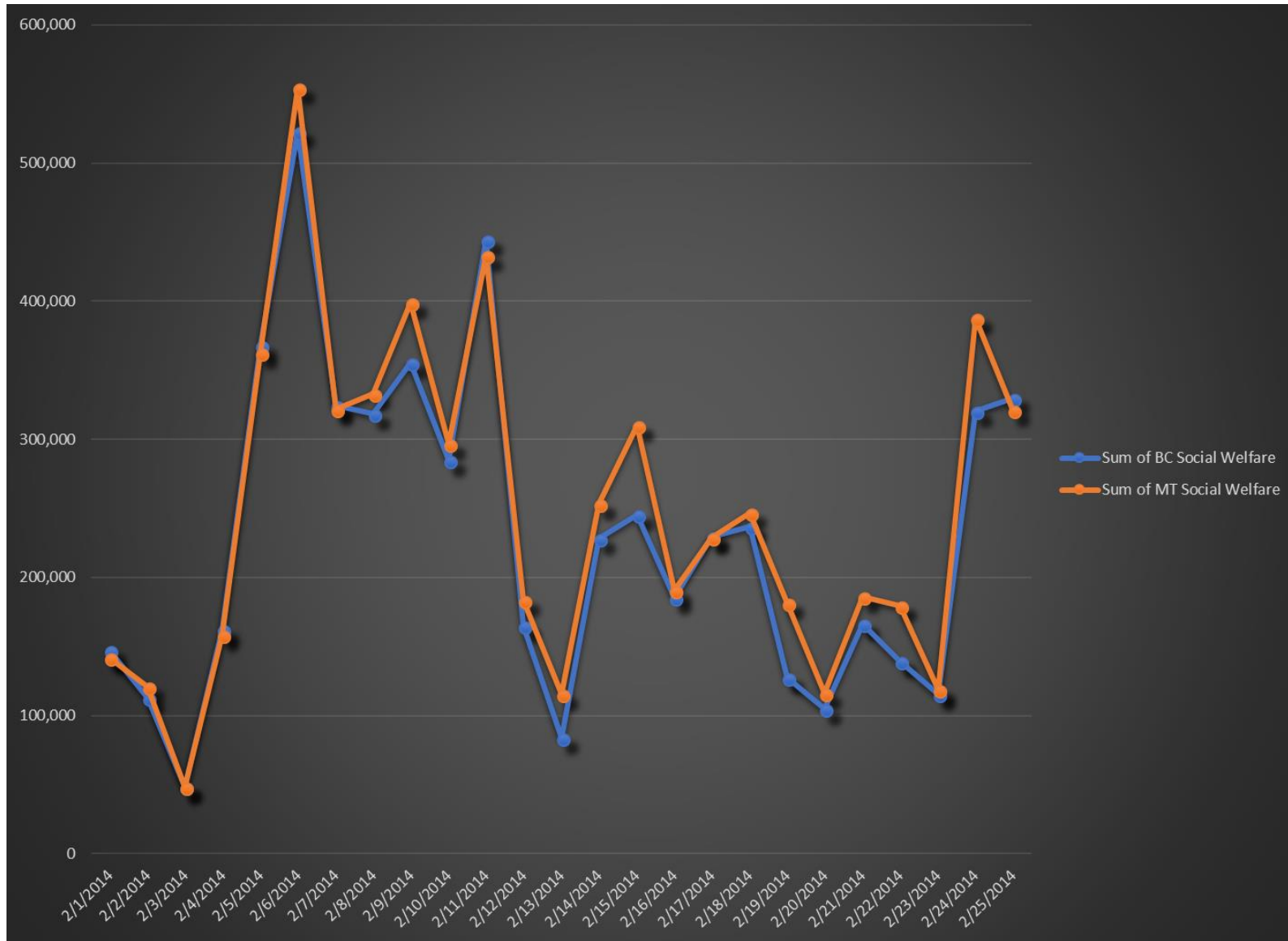
# Maximizing Social Welfare

- Matching actual social welfare
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - Controllable demand at exit point X is bounded at actual delivery
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral social welfare (summed over time total market surplus between buyers and sellers)
- Maximizing social welfare
  - Unbounded controllable supply at upstream entry point A
  - Non-controllable supply and demand set at actual hourly levels at all points except 3 power plants and downstream exit point X
  - Controllable demand at power plants is bounded at actual hourly deliveries
  - **Controllable demand at exit point X is unbounded**
  - All pressure and compressor constraints apply
  - Objective Function: maximize integral social welfare (summed over time total market surplus between buyers and sellers)

Results: incremental throughput at time of need is approximately 7% of total throughput



# Maximized social welfare is 8% higher than in the Base Case





# Summary of Results

	February 2014	March 2014
<b>Throughput increase</b>		
<b>Total potential</b>	12%	14%
<b>In time of need</b>	7%	9%
<b>Price reduction at downstream exit point</b>	28%	14%
<b>Increase in Social Welfare</b>	8%	7%

# Discussion

- Transient optimization
  - produces valid results for real-size systems
  - has a potential to increase pipeline capacity under constrained conditions
- Transient optimization can support operation of the Gas Balancing Market
- Gas Balancing Market if developed
  - can improve social welfare of the gas supply system
  - can be used to improve coordination of gas and electric systems and increase social welfare of both systems (to be confirmed in forthcoming simulations)
- Provided estimates of social welfare increase are conservative as they are based on the assumption that only electric generating plants participate in the balancing market