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The value of day-ahead coordination of power and natural gas network operations

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Abstract: The operation of electricity and natural gas transmission networks in the U.S. are increasingly interdependent, due to the growing number of installations of gas fired generators and the penetration of renewable energy sources. This development suggests the need for closer communication and coordination between gas and power transmission system operators in order to improve the efficiency and reliability of the combined energy system. In this paper, we present a co-simulation platform for examining the interdependence between natural gas and electricity transmission networks based on a direct current unit-commitment and economic dispatch model for the power system and a transient hydraulic gas model for the gas system. We analyze the value of day-ahead coordination of power and natural gas network operations and show the importance of considering gas system constraints when analyzing power systems operation with high penetration of gas generators and renewable energy sources. Results show that day-ahead coordination contributes to a reduction in curtailed gas during high stress periods (e.g. large gas offtake ramps) and a reduction in energy consumption of gas compressor stations.

Keywords: energy systems integration; sector coupling, power gas simulation; day-ahead and real-time coordination; power gas interdependence;

1. Introduction

Electricity and natural gas transmission networks in the United States (U.S.) are interconnected energy infrastructures whose operation and reliability depend on one another to a large extent. The most significant interconnections between both energy systems exists at natural gas fired power plants (GFPPs) and electric driven compressors (EDCs) in gas compressor stations. GFPPs represent generation entities in the power system, while at the same time they represent large consumers in the natural gas network. Gas generators require a minimum delivery pressure for operation, which, if violated, can lead to curtailment of gas offtakes, and in the worse case to a complete shut down of the GFPP [1,2]. EDCs, in contrast, represent electric loads in the power system, which are utilized by electric drivers to propel compressors in gas compressor stations in order to increase the gas pressure for pipeline transportation. In this paper, we focus mainly on the impact of GFPPs on the operation of the combined energy system.

The interconnection and interdependency between power and natural gas networks has become stronger in the past decades with the increase in the total installed capacity of GFPPs. U.S. natural gas deliveries to electric power consumers has increased by 60% between 2006 and 2016 [3]. This trend is partly due to the increase in electricity consumption, unconventional gas extractions, greenhouse gas emission (GHG) concerns, and lately, lower natural gas prices. It is expected that this trend will continue along with the future increase of renewable energy sources (RES). The need for flexibility in power systems increases with higher penetrations of variable RES, such as wind and solar power, due to their variable and uncertain nature. This flexibility can be partially mitigated, among other options, by fast-reacting gas-fired power plants. These power plants are operated differently under high RES penetrations by ramping upward and downward more frequently and to a larger extent, and by starting up and shutting down more often.

The times during which, and the extent to which GFPPs extract natural gas from the gas network, and the extent to which they do so, depend strongly on their generation schedule. In other words, higher RES penetrations

38 in the power system will not only impact how GFPPs interact within the power system, but they will also impact
39 how they interact with the natural gas network. For instance, a large wind or solar power forecast error could be
40 the cause of a large change in gas demand to be handled within the natural gas network operational and flexibility
41 boundaries.

42 Traditionally, gas and power transmission systems have been planned and operated independently, due to
43 the relatively weak coupling between both systems in the past. However, the growing interdependency between
44 the energy vectors suggests the need for models and tools to study how this trend may impact the operation of
45 both systems, and how to improve the coordination between gas and power transmission system operators (TSOs)
46 to increase operational efficiency and system reliability.

47 The research area of gas and power system interdependency is relatively new. Recently, a number of studies
48 in this area addressing the operational coordination between both energy carriers have been published. In [4,5],
49 the authors introduce an optimization model for the combined simulation of gas and electric power systems,
50 where both systems are interconnected through GFPPs. The model consists of a DC-OPF model for the power
51 system and a transient hydraulic optimization model for the gas system. However, the authors do not consider
52 important generator constraints such as the ramp rate and start-up and shut-down times and costs which are
53 essential for making day-ahead and real-time unit commitment decisions. Nevertheless, the results presented by
54 the authors indicate that increased coordination between gas and power system networks is required to ensure
55 security of supply and economic efficiency, particularly, under highly stressed conditions.

56 In [6] a security constrained economic dispatch model for integrated natural gas and electricity systems
57 was presented considering both wind power and power-to-gas processes. The authors use a transport model
58 to represent gas flow in pipelines, which does not properly account for changes in linepack and pressure. In
59 [7], a bi-level optimization model for day-ahead coordinated operation of an electricity network and a natural
60 gas system is developed. The coordination of both systems is carried out under steady state conditions, and as
61 such, cannot resolve the gas system impacts from dynamic behavior such as wind ramping. In [8], the authors
62 developed a framework for modeling and evaluating integrated gas and electric network flexibility, taking into
63 consideration changes in the heating sector. The constraints imposed by the gas network's local flexibility limits
64 are particularly considered. The authors use a DC-OPF approach to model the electric power system and both
65 steady-state and transient models for the gas system. Chaudry et al. [9] present a multi-time period combined
66 gas and electricity optimization model which highlights the consequences of failure of important facilities in
67 a combined network. Whilst a transient approach was used for the gas network, a direct current power flow
68 (DC-PF) approach was used for the electric network. In [10] the authors proposed a bi-level mathematical model
69 for the security-constrained unit commitment problem using fuzzy logic to model the uncertainty of the gas
70 system. A steady-state approach was used for the gas network and a DC-PF was used for the electric network.
71 Bai et al. [11] present an interval optimization model based on an operating strategy, which considers demand
72 response and wind power uncertainty. A steady-state mathematical model was applied for the gas system, while a
73 DC-PF model was used for the power system. In [12], a short term stochastic model was developed to coordinate
74 natural gas and wind energy units in power systems considering the constraints of the natural gas networks, such
75 as emission limits and wind energy variability. The authors use a DC-PF approach to model the electric power
76 system, while a steady state model was used to describe the operation of the natural gas system.

77 The majority of the models addressing the coordination between gas and power systems in the literature use
78 steady state models to describe the operation of the gas system, which is inadequate for operational analysis since
79 the changes in linepack and the time evolution of pressures are not captured appropriately in steady state models.
80 These phenomena are important considerations to account for however, is necessary, in order to account for the
81 pressure limits in the gas system when operating a large number of gas fired generators. Moreover most studies
82 do not distinguish between the day-ahead scheduling and real-time operation in the gas and power systems which
83 can lead to an underestimation of the flexibility needed in the operation of both systems. In addition, most studies
84 do not use a complete model for the gas system. For instance, the inertia and gravitational term in the pipe flow
85 equation (momentum equation), as well as key gas system facilities such as underground gas storage and LNG
86 regasification terminals are usually neglected. The latter are particularly important when studying the operation
87 of gas generators, since they provide additional flexibility to react to fluctuations in supply and demand.

88 In this paper, we close some of the gaps identified in the literature by developing a co-simulation platform
89 to study how the coordination between gas and power system TSOs may improve the operational efficiency and
90 reliability of interconnected gas and electric power transmission networks. The co-simulation platform consist of
91 a steady-state direct current (DC) unit commitment and economic dispatch model to simulate bulk power system
92 operations and a transient hydraulic model to simulate the operation of bulk natural gas pipeline networks. Here
93 a steady-state electricity model combined with a transient natural gas model is appropriate because the dynamics
94 of the electricity system are orders of magnitude faster than the dynamics of natural gas system, and our focus is
95 on natural gas system dynamics. The system models are implemented in two separate simulation environments,
96 namely, PLEXOS [13], a production cost modeling tool for electric power systems and *SAInt - Scenario*
97 *Analysis Interface for Energy Systems* [14–19]- an energy systems integration tool which includes a standalone
98 steady-state and transient hydraulic gas simulator. The data exchange between the simulations is conducted by
99 an interface that maps the power generation of gas generators in the power system with the corresponding fuel
100 offtake points in the gas system. The information exchanged between both simulation environments is:

101 • the day-ahead (DA) and real-time (RT) fuel offtakes of gas fired generators in the electric power system
102 and
103 • the fuel offtake constraints imposed by the gas network system on the power system, due to pressure
104 restrictions in the gas system.

105 The goals of this paper are:

106 • to develop a combined power-gas test system which can be used to test and benchmark different methods
107 for addressing the simulation of interdependent gas and electricity systems,
108 • to show the importance of considering the restrictions imposed by gas transmission networks when
109 operating a large number of gas fired generators in the electric power system, and
110 • to demonstrate the importance of coordination between gas and power TSOs to improve the efficiency and
111 reliability of the combined energy system.

112 To achieve these goals, the paper is structured as follows. In Section 2, we give a brief introduction to the gas and
113 power system models used in this study and present the structure of the co-simulation platform that coordinates
114 between the two simulation environments. In Section 3, we apply the co-simulation platform to study three
115 scenarios with different wind and solar penetration levels and compare how the day-ahead coordination between
116 the gas and power systems may impact the operation of both energy systems. Finally, in Section 4 we discuss the
117 results and give and provide a look at future studies that can be developed from the models and results presented
118 in this paper.

119 2. Methodology

120 Electric transmission networks in the U.S. are managed by vertically integrated utilities and RTOs
121 (Independent System Operators/Regional Transmission Organizations) depending on the region. These entities
122 are responsible for clearing the regional electricity market and for scheduling the operation of power system
123 generators to balance power system loads. In most U.S. electricity markets, the commitment and dispatch of
124 generators are scheduled in two steps, namely, the day-ahead scheduling (DA) and the real-time balancing (RT).
125 The first step involves clearing the day-ahead market 24 hours prior to the operating day, using a unit commitment
126 (UC) model to determine when and which generation units will be operated during the operating day and the
127 scheduled generation of these committed units. This is done considering their operational costs and constraints,
128 the projected power system loads and reserve requirements. The RT, on the other hand, involves clearing the
129 real-time intra-day market by solving a real-time UC and ED model typically every 5-15 minutes.

130 Gas transport systems, in contrast, are managed by gas transmission companies, which are responsible
131 for ensuring reliable and economic operation of the gas transmission system. In a gas market, day-ahead and
132 intra-day bi-lateral agreements based on steady rated nominations exist between gas traders (shippers) and
133 transmission system operators. The day-ahead nominations are used by gas transmission companies to develop a
134 day-ahead operational schedule before the actual operating day, which involves determining the cost-optimal

135 settings of controlled facilities, such as compressor stations, regulator stations, valves and gas storage facilities
 136 and at the same time ensuring that pressure limits and linepack requirements are fulfilled during the operating
 137 day. In real-time operation the control of the gas system is adjusted in response to changes in demand and supply
 138 based on practical experience and the evaluation of a large set of look-ahead-scenarios using transient hydraulic
 139 simulation models. In the past, these changes were relatively small and could be managed quite well, since the
 140 majority of gas customers were local distribution companies (LDC) with firm contracts and nearly constant hourly
 141 gas offtakes throughout the operating day. Presently, power generation companies account for more than half of
 142 total gas offtakes in some market regions in the U.S. These customers usually purchase interruptible contracts
 143 and may ramp-up and ramp-down more frequently and unexpectedly during the operations. This operating mode
 144 creates challenges for gas TSOs since gas generators may start-up and withdraw gas with short notice, leaving
 145 the gas TSO a limited amount of time to react to these changes. If this situation occurs in a moment where the
 146 gas system is in a stressed state, the gas TSO will typically curtail the gas offtakes of customers with non-firm
 147 contracts (e.g. GFPPs) to maintain reliable system operations and to ensure the delivery of gas to customers with
 148 firm contracts (e.g. LDC). Such undesired situations could be reduced and/or avoided if changes in power and
 149 natural gas systems are communicated and coordinated well in advance.

150 In this section, we present a co-simulation platform to examine how the coordination between gas and power
 151 TSOs may improve the reliability and efficiency of interdependent gas and electric power system operation. In
 152 Section 2.1, we provide an overview of the power system simulation model and the power system network used
 153 for the case studies. Section 2.2 explains the model used for simulating the gas system and the properties of the
 154 gas network model developed for the case study. Finally, Section 2.3 is dedicated to detailing the co-simulation
 155 platform and the different simulation runs conducted for the case studies.

156 2.1. Power System Model

157 Bulk power system operations are simulated by running a production cost model in PLEXOS, a commercial
 158 power system modelling tool. The model solves a mixed integer linear optimization problem to optimize unit
 159 commitment and economic dispatch decisions subject to energy balance, reserve requirements, generation,
 160 transmission, and demand constraints. The model simulates bulk power system operations by modelling DA
 161 commitment decisions and the resulting RT generation re-commitment and dispatch decisions. This is done
 162 by performing two simulations, one for day-ahead and one for real-time. Day-ahead commitment decisions
 163 of electricity generators that cannot be re-committed in real-time are passed and enforced from the day-ahead
 simulation to the real-time simulation. Day-ahead commitments are simulated considering day-ahead load, wind

Table 1. Power test system generation mix

Generation Type	Number of Generators	Installed Capacity [MW]
Hydro	4	1,035
Nuclear	1	238
Coal	2	52
Geothermal	2	176
Biomass	5	76
Biogas	2	45
Natural Gas	25	4,395
Oil	2	43

164 power, and solar power forecasts. These can lead to sub-optimal commitment decisions, especially in situations
 165 when net load (load minus wind and solar power) forecast errors are large. When net load is under forecasted,
 166 generators that were not committed in the day-ahead stage, and that have fast startup times (e.g. natural gas
 167 combustion turbines), will be re-committed and started in real-time to meet the electricity load not accounted for.
 168

169 In this paper we model a test power system defined in Figure 1. The test system is based on the IEEE
 170 118-bus test system. The hourly load profile utilized is the historical load from the San Diego Gas & Electric

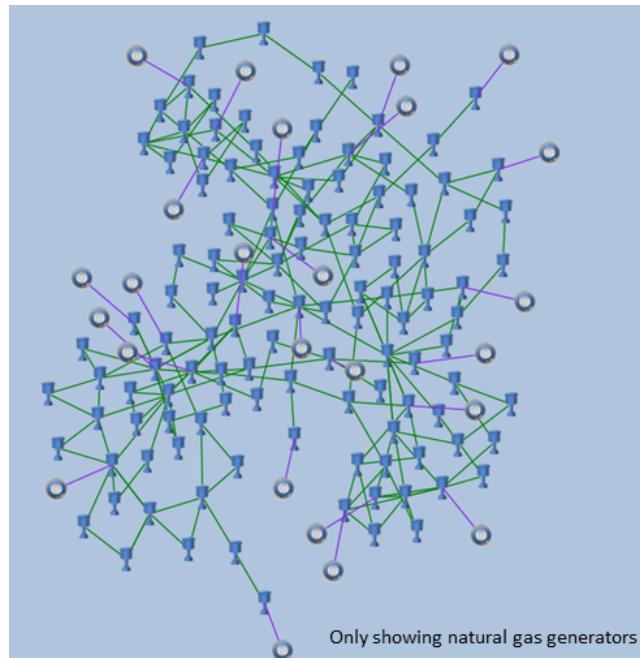


Figure 1. Topology of the IEEE 118-Bus power system network.

balancing authority area for the year 2002 [20]. Time-synchronous wind data and forecasts were utilized from areas near San Diego from the Wind Integration National Dataset Toolkit [21]. Time-synchronous solar power data and forecasts were based on data available from the National Solar Radiation Data Base [22] and created in [23]. The test system is designed with an electricity generation mix that resembles the current California generation mixture with high shares of gas-driven electricity generation capacity. Moreover, the test system can be modeled under three different scenarios in terms of wind and solar power penetration: 20%, 30%, and 40% in annual energy terms. Table 1 shows the number of conventional generators included in the modeled test power system, as well as their combined installed generation capacity. The model also includes 10 wind power plants and 10 solar photovoltaic power plants that have different installed generation capacity depending on the penetration scenario.

The 25 gas power plants included in the model are of four types: steam turbine, combined cycle, combustion turbine, and internal combustion engine. The first two types are committed in the day-ahead simulation due to their longer startup times, while the two latter types can be recommitted in the real-time simulation. They can all be redispatched in RT, as long as ramping, minimum and maximum generation constraints are respected. In this paper, we examine the value of considering natural gas network constraints on the day-ahead power plants commitment decisions.

2.2. Gas System Model

The operation of gas networks is inherently dynamic. Demand and supply are constantly changing and the imbalance between these two quantities is buffered by the quantity of gas stored in pipelines, also referred to as linepack. The linepack is proportional to the average gas pressure and gives the gas system additional flexibility to react to short term fluctuations in supply and demand. Thus, knowing the level of linepack and the pressures in the gas transport system is crucial for managing the operation of gas network. According to the law of mass conservation the linepack in a gas pipeline can only change in time if there is an imbalance between total supply and total demand, also referred to as the flow balance. This, in turn, implies that in order to reflect the changes in linepack, and thus the changes in pipeline pressure, a steady state model, where the flow balance is always zero (i.e. total supply is equal total demand), is inadequate. Thus, for operational studies, where the time evolution of linepack and pressure are crucial, a dynamic model for the gas system is necessary.

198 In this paper, we reflect the behavior of the gas system by a transient hydraulic model, which is implemented
 199 in the simulation software *SAInt*. *SAInt* contains a model for the most important facilities in the gas system,
 200 such as pipelines, compressor stations, regulator stations, valve stations, underground gas storage facilities,
 201 LNG terminals and other entry and exit stations. The mathematical models implemented in *SAInt* have been
 202 published in [15–19], where a detailed description and application of the simulation tool are given. Furthermore,
 203 the accuracy of the transient gas simulation model has been successfully benchmarked against a commercial gas
 204 simulation tool and other models in the scientific literature [15,16].

The topology of the gas network model (GNET90) used in this study is depicted in Figure 2 and the basic properties of the network are listed in Table 2.

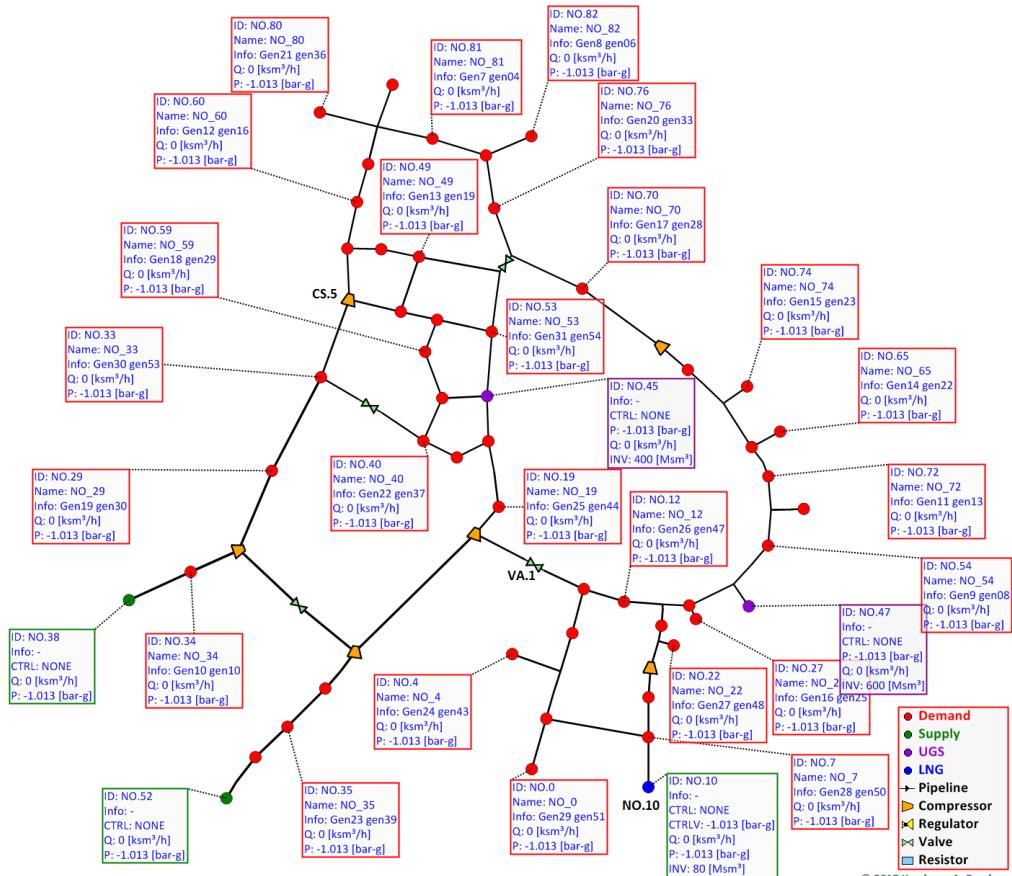


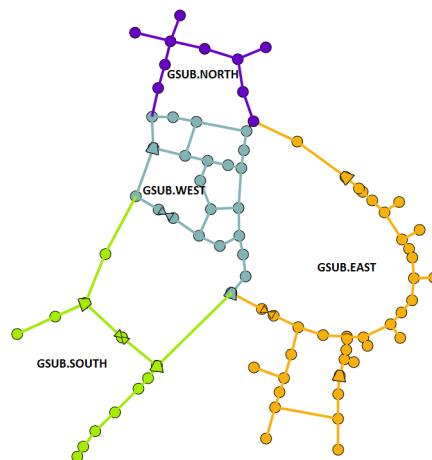
Figure 2. Topology of the GNET90 gas network. Labels with a red frame are pointing to GFPP, labels with a green frame indicate supply nodes, and those with a purple frame UGS facilities.

The gas model has a total pipe length of 3734 km which is subdivided into 90 pipe elements. The model includes 6 compressor stations for increasing the gas pressure for transportation and 4 valve stations for controlling the gas stream, and islanding sections of the network. The pipe and non-pipe elements are interconnected at 90 nodes, where gas can be injected or extracted from the network. The 90 nodes contain 3 supply nodes, which include one LNG Terminal with a working gas inventory of 80 Msm^3 , 2 underground gas storage facilities with a total working gas inventory of 1,000 Msm^3 , 46 gas offtake stations, which include 25 GFPPs and 17 city gate stations (CGS). The minimum delivery pressure at each GFPP is set to 30 bar – g, while the minimum pressure at each CGS is set to 16 bar – g. Gas offtake stations with minimum delivery pressure limits are subject to gas curtailment if their corresponding nodal pressure cannot be maintained above the pressure limit for a given scheduled offtake. The difference between the scheduled offtake and the actual delivered quantity are integrated over the simulation time window to yield a quantity referred to as gas not supplied (GNS), or energy not supplied if multiplied with the gross calorific value (GCV).

Table 2. Properties of the GNET90 gas network

Property	Value	Unit
Nodes	90	
Pipelines	90	
Compressor Stations	6	
Valve Stations	4	
Underground Gas Storage Facilities (UGS)	2	
LNG Regasification Terminals	1	
Gas Fired Power Plants (GFPP)	25	
City Gate Stations (CGS)	17	
Cross Border Import Stations (CBI)	2	
Total Pipe Length	3,734	[km]
Total Geometric Pipe Volume	1,539,221	[m ³]
Total Available Compression Power	240	[MW]
Min. Pipe Diameter	600	[mm]
Max. Pipe Diameter	900	[mm]
Min. Elevation	0	[m]
Max. Elevation	1118	[m]

Furthermore, the gas system is divided into 4 subsystems, as shown in Figure 3. The parameters of

**Figure 3.** GNET90 gas network showing the topology of the network with the 4 defined subsystems.

219

220 the subsystems (e.g. linepack, minimum pressure etc.) are used to monitor and control the pressure and
 221 linepack of specific regions in the network and to change the control modes and set points of controlled facilities
 222 (e.g. compressor stations, valves, etc.) to maintain system operating conditions, similar to actual gas network
 223 operations.

224 *2.3. Co-Simulation Platform*

225 The co-simulation platform is divided into two separate simulators which communicate and exchange
 226 data through a co-simulation interface implemented in SAInt, which is depicted in Figure 4. The interface is
 227 responsible for mapping the hourly fuel offtakes of gas generators in the power system model to the corresponding
 228 fuel offtake points in the gas model and for transferring the hourly fuel offtake constraints computed by the gas
 229 simulator back to the corresponding gas generators in the power system model. Table 3 shows how the different
 230 gas generator objects in the power system model are mapped with the fuel gas offtake nodes in the gas system.



Figure 4. Snapshot of the co-simulation interface implemented into *SAInt*.

231 The hourly fuel offtakes of gas generators computed by PLEXOS are given in the energy units of (MMBTU),
 232 and correspond to the amount of thermal energy required to generate electric energy for the given hour. This
 233 energy requirement is converted to an equivalent gas flow rate in reference conditions by assuming a constant
 234 gross calorific value of 38.96 MJ / sm³ for natural gas.

235 The simulation of the combined energy system is divided into DA and RT simulations as depicted in Figure
 236 5. The DA simulation is first run for the power system and the resulting hourly fuel offtake profiles of gas
 237 generators are exported from PLEXOS to SAInt via the co-simulation interface (see. Figure 4) using the mapping
 238 information provided in Table 3.

239 The fuel offtake profiles are then used together with the day-ahead load profiles of other gas customers and
 240 the settings of controlled facilities to run a dynamic simulation of the gas system for the day-ahead schedule. To
 241 run a dynamic simulation for the gas system, the initial state of the gas system has to be known. To obtain an
 242 initial state, we first run a steady state simulation and then use the solution of the steady state as an initial state
 243 to run an intermediate dynamic simulation with constant flow profiles, which eventually converges to a steady
 244 state condition. The reason for running the intermediate dynamic simulation is to ensure the right settings for all
 245 compressor stations and that constraints violated in the steady state are treated by the solver in the intermediate
 246 dynamic simulation. The solver does this by changing the control settings of affected facilities (e.g. curtailment
 247 of offtakes, if pressure violations are detected in the steady state simulation).

248 The results of the dynamic gas system simulation include the computed fuel offtake for gas generators,
 249 which may differ from the scheduled day-ahead fuel offtake profile computed for gas generators in the power
 250 system model if gas curtailments were necessary to respect pressure limits in the gas system. The fuel offtake

Table 3. Mapping between power system nodes in PLEXOS and gas system nodes in *SAInt* for the 25 gas fired generators.

PLEXOS Generator ID	SAInt-Node ID
gen04	NO.81
gen06	NO.82
gen08	NO.54
gen10	NO.34
gen13	NO.72
gen16	NO.60
gen19	NO.49
gen22	NO.65
gen23	NO.74
gen25	NO.27
gen28	NO.70
gen29	NO.59
gen30	NO.29
gen33	NO.76
gen36	NO.80
gen37	NO.40
gen39	NO.35
gen43	NO.4
gen44	NO.19
gen47	NO.12
gen48	NO.22
gen50	NO.7
gen51	NO.0
gen53	NO.33
gen54	NO.53

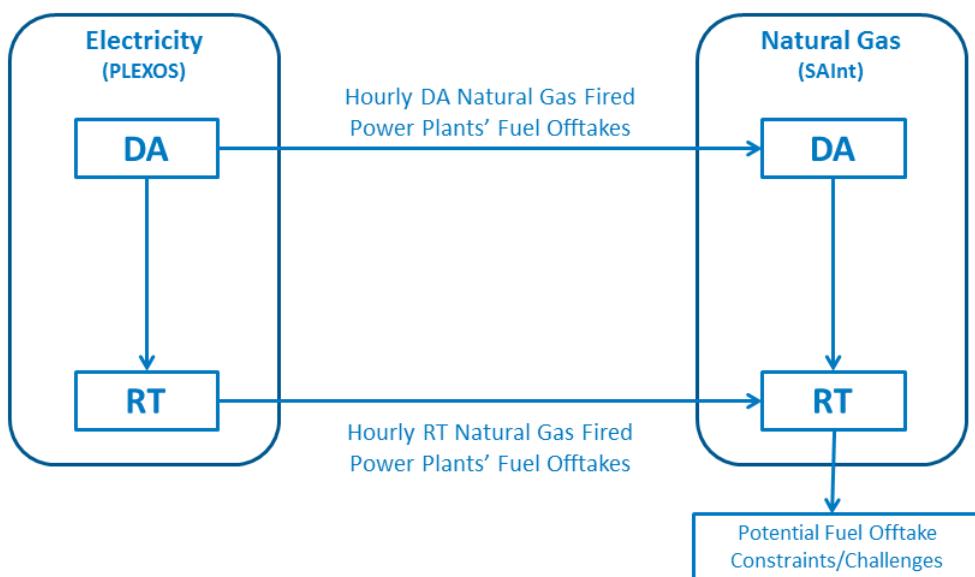


Figure 5. Simulation Model for Business As Usual.

251 constraints computed by *SAInt* can be reported back to PLEXOS to recompute the DA power system simulation,
252 which would generate a new unit commitment schedule for running the real-time power system simulation.

253 We differentiate between two different cases which differ in terms of how the information about the fuel
254 offtake constraints from the DA gas system simulation are utilized in the power system simulation. We label

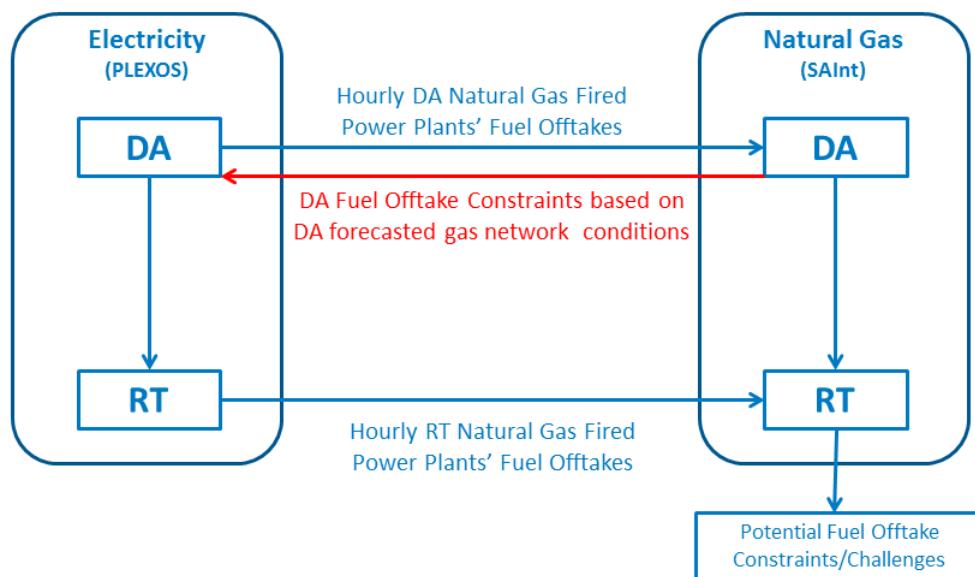


Figure 6. Simulation Model for Day-Ahead Coordination.

255 these situations Business As Usual and DA-Coordination, and they are illustrated in Figures 5 & 6. In the
 256 business as usual case depicted in Figure 5, the fuel offtake constraints from the gas system are not utilized by
 257 the power system, while in the DA-Coordination case illustrated in Figure 6 the fuel offtake constraints are used
 258 to recompute the DA power system simulation. This provides new unit commitment solution for the generators
 259 that is then applied in the RT power system simulation.

260 In both cases, the fuel offtake profiles from the RT power system simulation are provided to the gas system
 261 for running a RT gas system simulation using the same procedure as for the DA simulation. The fuel offtake
 262 constraints computed for the RT gas system simulation can be sent back to the power system to analyze how the
 263 coordination between both systems impacted the operation of the power system.

264 3. Results

265 In this section we present the results of a case study that highlights the differences between coordinating the
 266 gas and power systems operation at these time-frames with the current practice of no coordination.

267 3.1. Scenarios

268 The scenarios used to showcase the differences are divided into the following:

269 • Renewable Penetration:

270 In terms of level of wind and solar penetration in the generation mix of the power system, we distinguish
 271 between three wind and solar penetration levels, 20%, 30%, and 40% in terms of annual electricity
 272 generation (as illustrated in Figure 7). Figure 7 shows the share of electricity generation from wind,
 273 solar, and natural gas for the four weeks selected for the analysis. The annual penetrations in energy
 274 terms of variable renewable energy sources in the three scenarios correspond to 20%, 30% and 40%. The
 275 scenarios include higher penetrations of solar power than wind power. However, for the 4 weeks selected
 276 the corresponding wind and solar penetrations do not represent the annual average and are slightly smaller
 277 than 20%, 30%, and 40%. The share of electricity generation from natural gas decreases as variable
 278 renewable penetration increases because wind and solar power displace electricity generation from natural
 279 gas fired generators.

280 • Season:

281 The simulation data for the gas and power system are available for an entire year. However, to highlight
 282 the differences between the approaches, we select for each quarter of the year the week with the highest

upward-ramp of gas fired generators in the power system. The selection is based on the frequency and magnitude of upward-ramps. We choose to focus on the weeks with highest natural gas offtake ramps as a proxy for weeks that may experience the largest challenges from a natural gas network perspective. For each wind and solar penetration level the following weeks were selected for the case studies:

- Q1: From January 29, 2012, 00:00 to February 5, 2012, 00:00
- Q2: From April 1, 2012, 00:00 to April 8, 2012, 00:00
- Q3: From September 23, 2012, 00:00 to September 30, 2012, 00:00
- Q4: From October 28, 2012, 00:00 to November 4, 2012, 00:00

• **Level of coordination:**

For each wind and solar penetration level and each selected quarter, two different cases in terms of level of coordination between the gas and power system are investigated, which we denote as follows:

- *Business As Usual*: Fuel offtake constraints computed from the DA gas system simulation *are not considered* in the power system simulation. DA and RT power system simulation do not take the fuel offtake constraints of the gas system into account.
- *DA-Coordination*: Fuel offtake constraints computed from the DA gas system simulation *are considered* in the power system simulation. The power system recomputes its DA using the fuel offtake constraints and uses the resulting unit commitment schedule for the RT simulation

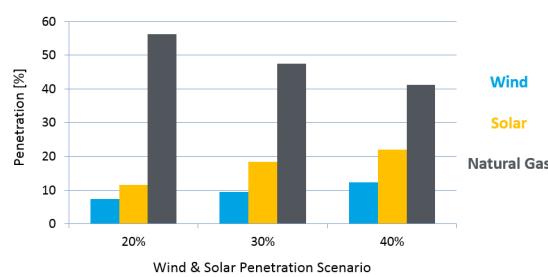


Figure 7. Overview of wind, solar and natural gas generation mix for the three studied simulation cases considering only the 4 selected weeks (1 per quarter).

The simulation of the gas system requires additional definitions beside the fuel offtake profiles received from the power system additional definitions of control settings in respect to specific conditions in the network. Each simulation in *SAInt* is modeled as a scenario, which has the following properties:

- Scenario type (steady state, succession of steady steady state, or dynamic simulation)
- Scenario time window (simulation start time and end time)
- Scenario time step (determines the time resolution of the simulation and thus, the number of time steps computed)
- Initial State (for a dynamic simulation an initial state of the gas network is needed)
- Scenario schedule and boundary conditions (includes all control settings and flow schedules for controlled facilities that may change in time. Settings for controlled facilities can be triggered based on certain conditions in the network, e.g. open a valve if the pressure in a region is below a certain value or increase the outlet pressure set point of the compressor if the linepack in a region is below a specific value)

3.1.1. Gas System Control Settings

For all gas system scenarios, we define the following control settings which depend on the conditions in the gas system during the simulation run.

Fuel Offtake Curtailment For all fuel offtake nodes of gas fired generators we define a minimum pressure limit of $30 \text{ bar} - g$ and for all city gate stations a limit of $16 \text{ bar} - g$. The scheduled offtake at these stations will be curtailed such that the pressure limits at the corresponding node are not violated.

318 Compressor Operations Compressor Station CS.5 is used for controlling the pressure in subsystem
319 GSUB.NORTH. If the minimum pressure in GSUB.NORTH goes below $30\text{bar} - g$ CS.5 will increase its outlet
320 pressure by $1/15\text{ bar} - g/\text{min}$ to restore the pressure level in subsystem GSUB.NORTH, thus, reducing risk of
321 potential fuel offtake curtailments of gas generators in that region, which require a minimum fuel gas pressure of
322 $30\text{bar} - g$ for operation. Increasing the outlet pressure, however comes with a cost, since the compression of gas
323 requires energy from the driver. Thus, to reduce the energy consumption in times of reduced loads, we define an
324 additional conditional control for CS.5, which reduces the outlet pressure set point by $1/15\text{ bar} - g/\text{min}$ if the
325 minimum pressure in GSUB.NORTH is above $32\text{bar} - g$.

326 LNG Terminal Operations LNG terminal NO.10 has a limited quantity of LNG in its storage tank which
327 is regasified and injected into the network. If the working inventory of the terminal is depleted the terminal
328 cannot inject gas into the network and has to shut down, until it is supplied with LNG from a LNG vessel. *SAInt*
329 is able to model and schedule the arrival of LNG vessels and the discharge of LNG from the vessel to the LNG
330 storage tank by defining the arriving time and size of the LNG vessel and the discharge rate. In all studied
331 scenarios the arrival of LNG vessels at NO.10 is scheduled every third and sixth day at 6:00 AM after the start of
332 the simulation with an arriving vessel size of $40,000\text{ m}^3$ of LNG and a discharge rate of $120\text{ m}^3/\text{min}$.

333 Valve Operations The shut down of LNG terminal NO.10, due to the depleted working inventory may
334 cause pressure reductions in the surrounding market area, which may eventually lead to curtailments of scheduled
335 fuel offtakes from customers in that area, in particular, GFPPs. To avoid this undesired situation, we define
336 control mode changes for valve station VA.1 which connects subsystem GSUB.SOUTH with GSUB.EAST. If
337 the LNG terminal is not supplying the network with gas (i.e. control mode is OFF) and the minimum pressure
338 in GSUB.EAST is below $30\text{ bar} - g$, valve station VA.1 should open, while if the LNG terminal is operating
339 and the minimum pressure in the subsystem is above $32\text{ [bar} - g]$ the station should close, to reduce the energy
340 consumption of the upstream compressor station.

341 3.1.2. Gas System Simulation Settings

342 In addition to the control settings explained above, the simulation parameters and gas properties listed in
343 Table 4 are applied for all studied scenarios. The time step for the dynamic simulation is set to 30 min , however,
344 the time resolution is adapted by the dynamic time step adaptation method implemented into *SAInt* if rapid
transients occur in the course of the simulation [17].

Table 4. Input parameter for transient simulation of GNET90 gas network model

Parameter	Symbol	Value	Unit
time step	Δt	1800	[s]
total simulation time	t_{max}	168	[h]
isothermal gas temperature	T	288.15	[K]
dynamic viscosity	η	10^{-5}	[kg/m · s]
reference pressure	p_n	1.01325	[bar]
reference temperature	T_n	288.15	[K]
critical pressure	p_{crit}	45	[bar]
critical temperature	T_{crit}	193.7	[K]
relative density	d	0.6	[\cdot]
gross calorific value	GCV	38.96	[MJ/sm ³]

345

346 3.2. Global Results

347 In the following section, we discuss aggregated results for the computed scenarios, which are illustrated in
348 Figures 8 & 9. Figure 8 compares the total aggregated gas not supplied (GNS) for the four quarters for the three
349 studied wind and solar penetration levels and for the coordination level Business As Usual and DA-Coordination.

350 As can be seen, the GNS for Business As Usual is more than twice as high as for DA-Coordination for all wind &
 351 solar penetration levels, which means the coordination between the gas and power system reduced significantly
 352 the curtailment of offtakes in the gas system. Furthermore, the level of curtailment of offtake curtailment in the
 353 gas system decreases with increasing wind and solar penetration, though one would expect the opposite, since
 354 an increased wind & solar penetration level is expected to increase the number of upward and downward ramp
 355 cycles and thus affecting pressure limits in the gas system. However, a reason for the observation could be that a
 356 higher wind and solar penetration level means less average fuel offtake of gas fired generators, which also means
 357 less stress and higher average pressures in the gas system, which in turn makes the gas system less sensitive
 358 to potential fuel offtake ramps of gas fired generators to back up wind and solar sources. At higher variable
 359 renewable energy penetrations, however, net load ramps are larger and these can cause more frequent natural gas
 pipeline network constraints on power plants' natural gas off-take. The reduced curtailments in the gas system

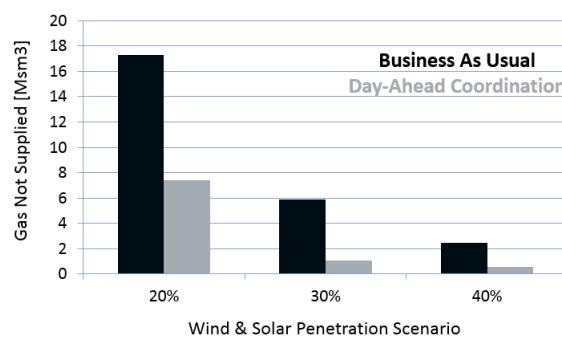


Figure 8. Gas not supplied in the Business As Usual and DA-Coordination case. Aggregated results for 4 weeks (1 per quarter) with highest system-wide natural gas offtake ramps.

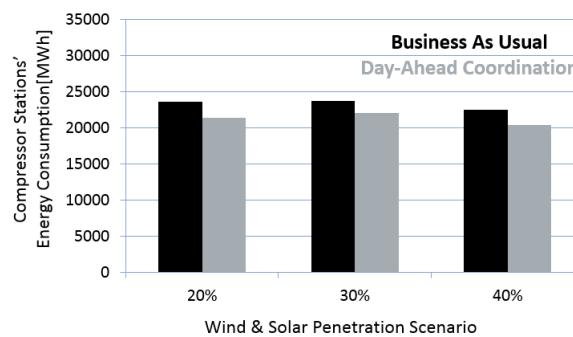


Figure 9. Total energy consumption of gas compressor stations in the Business As Usual and DA-Coordination case. Aggregated results for 4 weeks (1 per quarter) with highest system-wide natural gas offtake ramps.

360 in the DA-Coordination case also positively impacted the total energy consumption of compressor stations in
 361 the gas system independent of the wind and solar penetration level, as illustrated in Figure 9. The total energy
 362 consumption for the Business As Usual scenario is always roughly 10% higher than in the DA-Coordination case.
 363

364 3.3. Specific Examples

365 3.3.1. Fuel Offtake Curtailment

366 Figure 10 shows an example of fuel offtake curtailment at node NO.80 of gas generator gen36 for the DA
 367 gas system simulation for Q1 and for a 20% renewable penetration level. The top plot shows the time evolution
 368 of the nodal pressure, the middle plot compares the time evolution of the scheduled offtake profile (i.e. profile
 369 received from the results for the DA power system simulation in PLEXOS) to the actual offtake profile (i.e.
 370 offtake profile computed by the DA gas system simulation in SAInt considering the operation and pressure

371 limits in the gas system) and the bottom plot is the cumulative quantity of gas not supplied from the start of the
 372 simulation (i.e. the integral of the area between the green (scheduled offtake, NO.80.QSET) and blue curve (actual
 373 offtake, NO.80.Q) in the middle plot). As can be seen, the scheduled offtake is curtailed whenever the pressure in
 374 node NO.80 reaches the pressure limit of 30 bar – g.

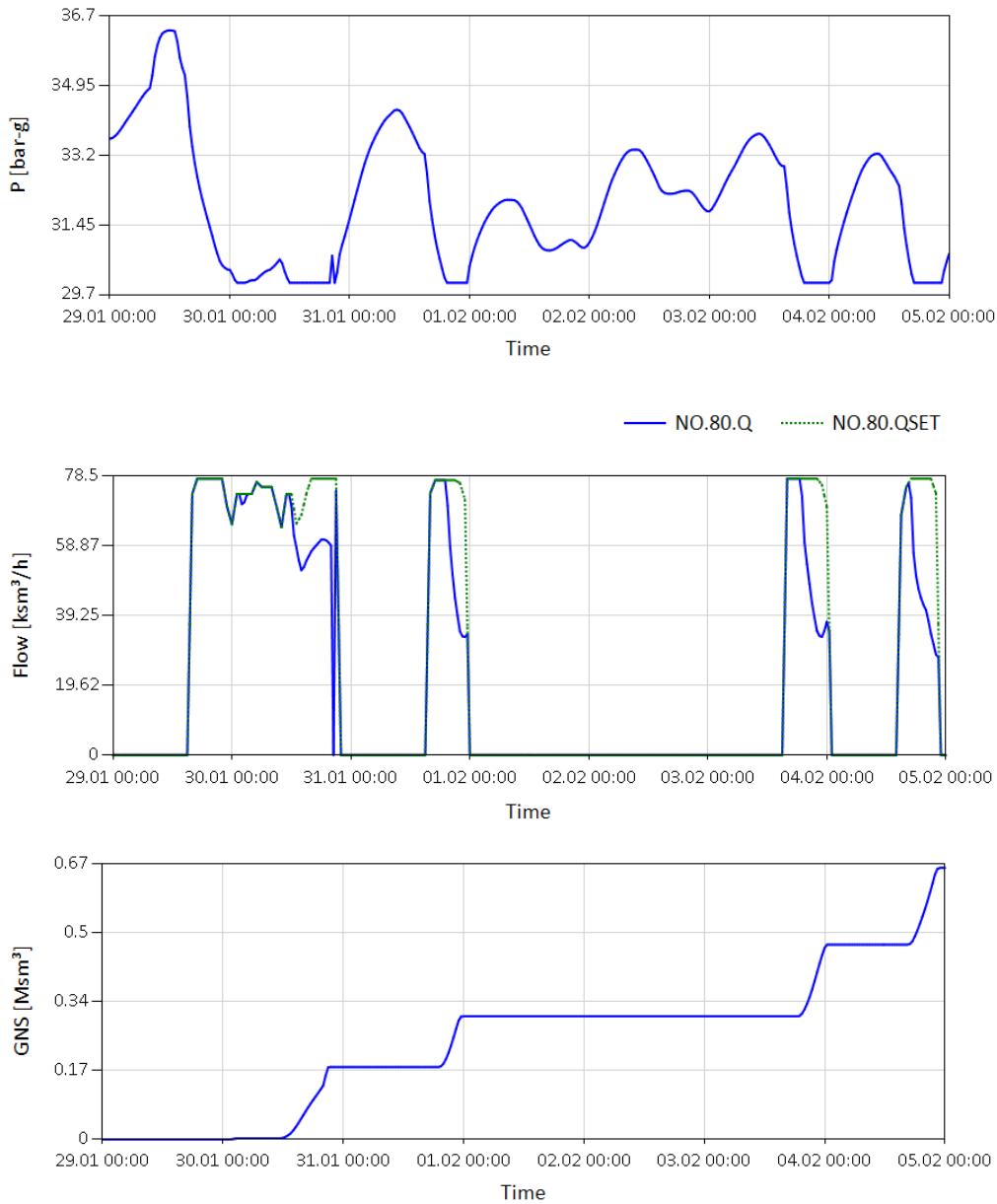


Figure 10. Time evolution of pressure, scheduled offtake, actual offtake, and cumulative gas not supplied for fuel offtake node NO.80 of gas generator gen36 for DA simulation for Q1 and for a 20% wind and solar penetration.

375 3.3.2. Compressor Operations

376 The conditional control prescribed to compressor station CS.5 is illustrated in Figure 11 for the DA gas
 377 system simulation for Q1 and for a 20% renewable penetration level. The top plot shows the time evolution of
 378 the minimum pressure in subsystem GSUB.NORTH, while the center and bottom plot show the time evolution
 379 of the outlet pressure and the driver power for compressor station CS.5, respectively. As can be seen, the
 380 outlet pressure of the compressor station increases linearly if the minimum pressure in GSUB.NORTH decreases

381 below 30bar – g and decreases linearly if the minimum pressure in GSUB.NORTH increases above 32bar – g.
382 Furthermore, the energy consumption of the compressor station increases if the outlet pressure increases and
383 decreases if the outlet pressure decreases.

384 3.3.3. LNG Terminal Operations

385 The top left plot in Figure 12 shows the time plot for the working inventory of LNG terminal NO.10 for the
386 DA gas system simulation for Q1 and for a 20% renewable penetration level. The inventory decreases almost
387 linearly right from the start of the simulation until the working inventory is depleted, which causes the station to
388 stop its gas supply to the network as can be seen in the bottom left and right plot in Figure 12, where the time
389 evolution of the control mode and gas supply are plotted. The terminal resumes its gas supply after the arrival of
390 the first vessel on February 1, at 6:00 AM. The LNG transported by the vessel is discharged and relocated to the
391 storage tanks in the terminal as can be seen in the increasing working inventory after the arrival of the vessel. The
392 discharge process takes approximately 5,5 h, then the inventory starts decreasing again until the second vessel
393 arrives.

394 3.3.4. Valve Operation

395 Figure 13 shows how the conditional control setting for valve station VA.1 is respected in the simulation for
396 the DA gas system simulation for Q1 and for a 20% renewable penetration level, where the minimum pressure in
397 subsystem GSUB.EAST and the control and flow rate of valve station VA.1 is plotted over time. As can be seen,
398 the valve station is opened (i.e. control mode BP) and supplies gas to GSUB.EAST if the minimum pressure in
399 the subsystem is below the defined pressure threshold.

400 4. Conclusion

401 In this paper, we developed a co-simulation platform to assess the operation and interdependence between
402 natural gas and power transmission networks. The platform consists of a steady state DC unit commitment
403 and economic dispatch model to simulate bulk power system operations and a transient model to simulate
404 the operation of bulk natural gas pipeline networks. The models are implemented in two separate simulation
405 environments, namely, PLEXOS [13], a production cost modeling tool for electric power systems and *SAInt*
406 [14], a transient hydraulic gas system simulator. The data exchange and communication between both simulation
407 environments are established by an interface that maps the power generation of gas generators in the power
408 system to the corresponding fuel offtake points in the gas system.

409 The co-simulation platform was applied on a case study on an interconnected gas and power transmission
410 network test system with the objective to examine to what extent the day-ahead coordination between gas
411 and power TSOs may impact the efficiency and reliability of the coupled energy systems. The two networks
412 are interconnected at 25 gas fired power plants, which represent generation units in the power system and
413 gas offtake points in the gas system. The case study was divided into three dimensions, namely, the level of
414 renewable penetration, the the time period under consideration with the highest upward and downward ramp of
415 gas generators, and finally, the level of coordination between the gas and power system networks (day-ahead
416 coordination and no coordination between both energy networks). The results from the case study indicate that
417 day-ahead coordination between gas and power system networks contributes to a reduction in curtailed gas during
418 high stress periods (e.g. large gas offtake ramps) and a reduction in gas consumption at gas compressor stations.

419 In the future we intend to extend the co-simulation platform by a quasi-dynamic real-time simulation of
420 gas and power systems operation, which will enable the assessment of the impact of real-time coordination and
421 regulatory constraints on the efficiency and reliability of coupled gas and power system networks. We also intend
422 to analyse scenarios with higher penetration of renewable generation.

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427 the natural gas test system, and wrote the manuscript with input from all authors; Rostand Tresor Sopgwi conducted the

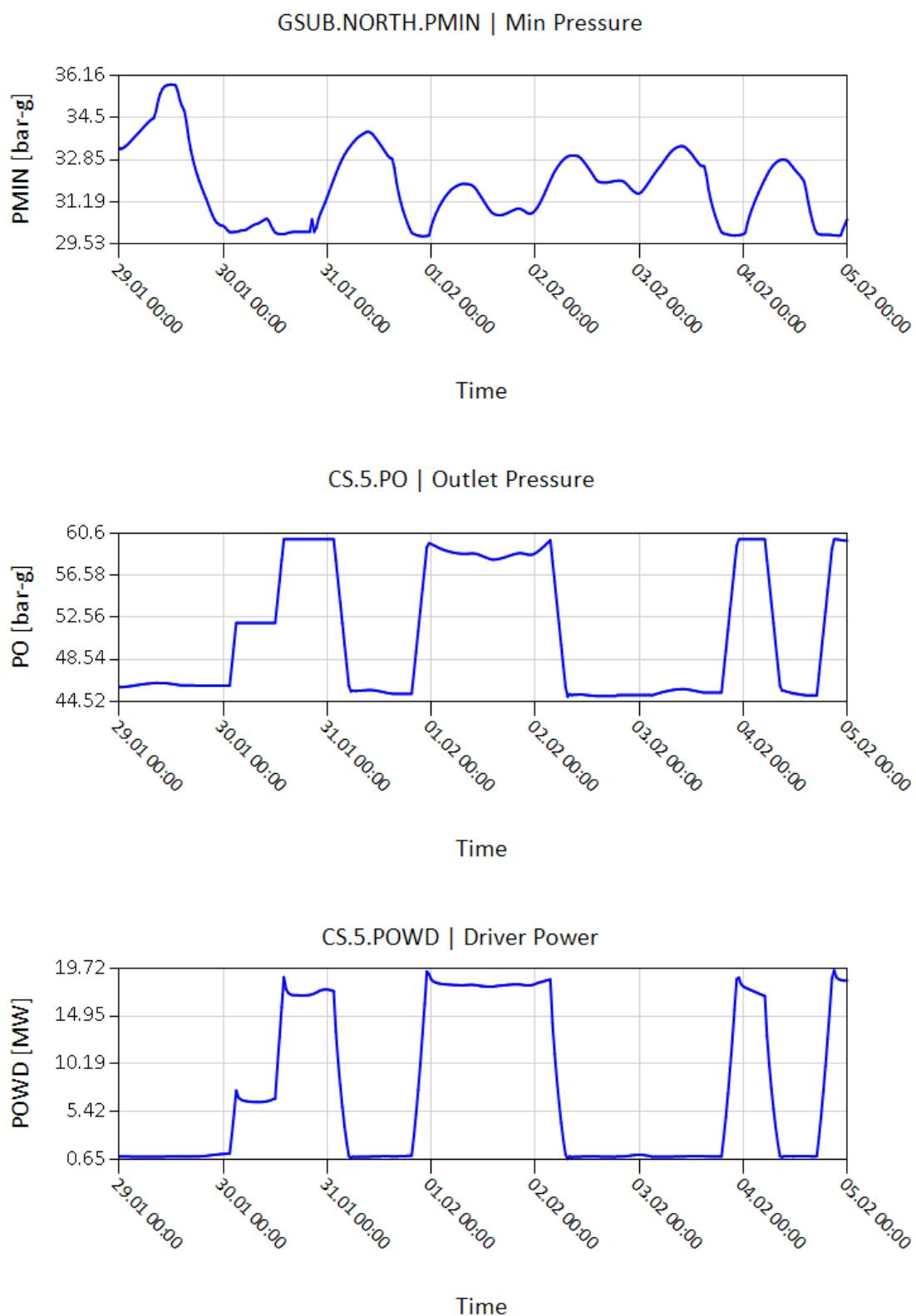
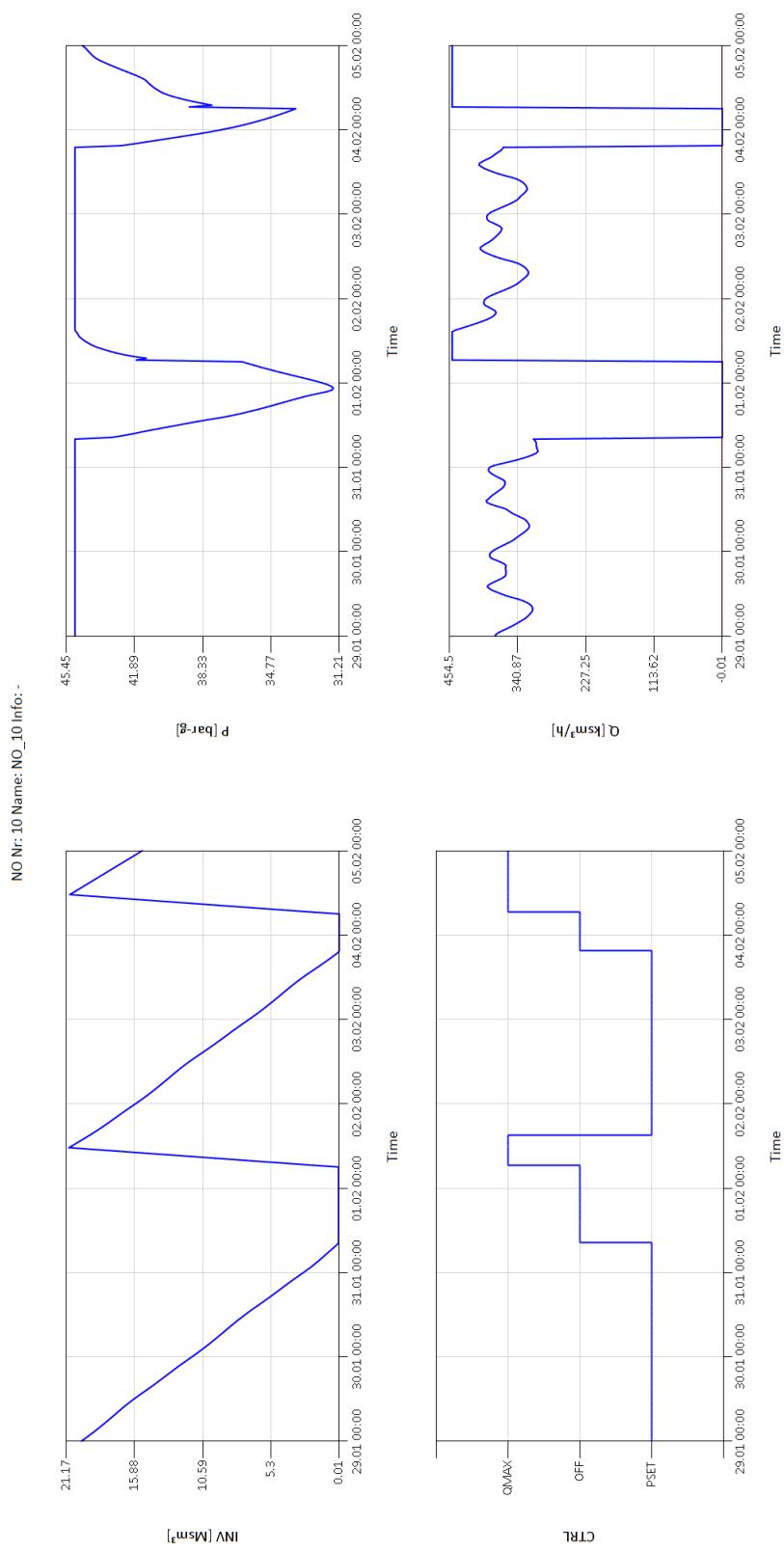


Figure 11. Time evolution of minimum pressure in subsystem GSUB.NORTH and outlet pressure and driver power for compressor station CS.5 for DA simulation for Q1 and for a 20% wind and solar penetration.

Figure 12. Time evolution of working gas inventory (NO.10.INV), station control (NO.10.CTRL), pressure (NO.10.P) and gas supply (NO.10.Q) at LNG Terminal NO.10 for DA simulation for Q1 and for a 20% wind and solar penetration.



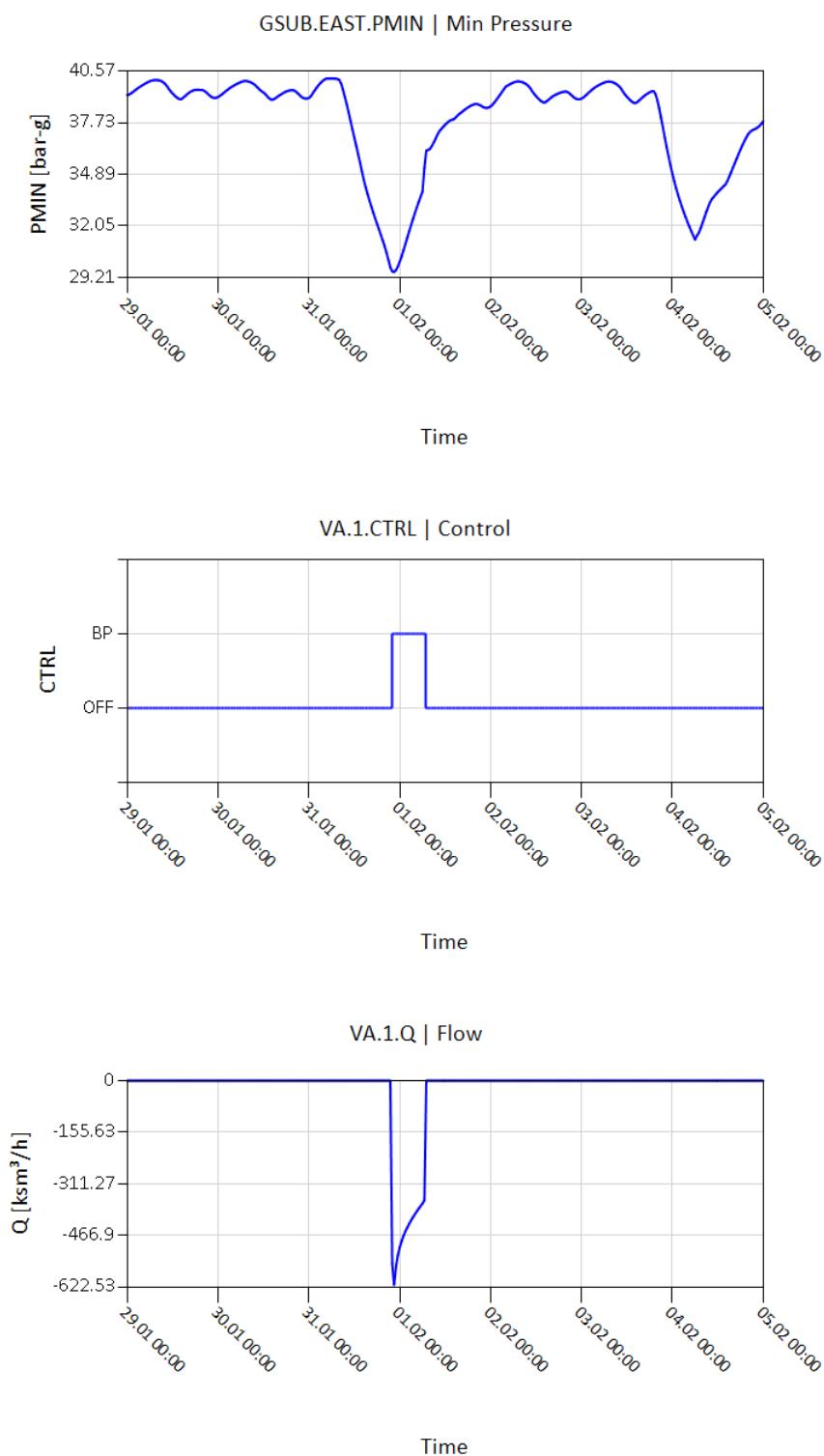


Figure 13. Time evolution of minimum pressure in subsystem GSUB.EAST and control mode and flow rate at valve station VA.1 for DA simulation for Q1 and for a 20% wind and solar penetration.

428 literature review and ran the natural gas network simulations in SAInt; Bri-Mathias Hodge provided valuable feedback and
429 helped shape the analysis; Carlo Brancucci designed the study, managed the project, and ran the power system simulations in
430 PLEXOS.

431 Abbreviations

432 The following abbreviations are used in this manuscript:

DA:	Day-Ahead
DC:	Direct Current
DC-OPF:	DC-Optimal Power Flow
DC-PF:	DC-Power Flow
ED:	Economic Dispatch
EDC:	Electric Driven Compressor
GFPP:	Gas Fired Power Plant
GCV:	Gross Calorific Value
433 ISO:	Independent System Operator
LNG:	Liquefied Natural Gas
TSO:	Transmission System Operator
RES:	Renewable Energy Sources
RA:	Reserve Allocation
RT:	Real-Time
RTO:	Regional Transmission Organization
UC:	Unit Commitment
UGS:	Underground Gas Storage

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