

Mathematical Modelling, Simulation and Optimization Using the Example of Gas Networks

Existence of Equilibria in Energy Markets with Convex and Nonconvex Players

<u>J. Grübel</u>, O. Huber, L. Hümbs, M. Klimm, M. Schmidt, A. Schwartz Trends in Mathematical Modelling, Simulation and Optimisation: Theory and Applications Online, 03-02-2021







Open-Minded



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Motivation

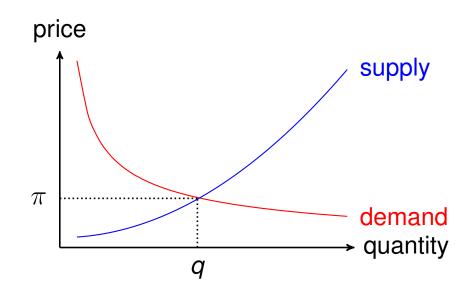




Fundamental Welfare Theorems

Fundamental theorems of welfare economics (Arrow, Debreu, Walras)

Under suitably chosen assumptions (esp. convexity), competitive equilibria exist, are unique, and Pareto-optimal, i.e., there exists a 1-1 correspondence of market equilibria and welfare optima.

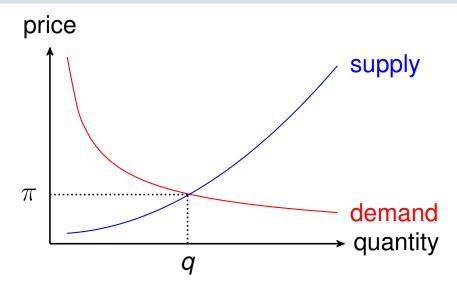




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from https://gaslib.zib.de/data.html



Central Research Questions

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Given an energy market game with **nonconvexities**.

- 1. Can we decide existence of a competitive market equilibrium?
- 2. How often exist equilibria for respective applications?

The Market Equilibrium Problem





Simultaneous Competitive Market Game (MEP)

All players $i \in I \dots$

- ... are price-takers
- ... have perfect information
- ... solve the optimization problem

$$\min_{y_i} f_i(y_i, \pi) := c_i(y_i) + \pi^T h_i(y_i) \quad \text{s.t.} \quad y_i \in Y_i$$

In addition, their best-responses satisfy the market clearing conditions

$$\sum_{i\in I}h_i(y_i)=0$$

- π Price vector
- *f_i* Objective function of the player
- y_i , Y_i Decision variables, feasible set of the player



The Corresponding Welfare Optimization Problem (WFP)

$$\min_{y} \quad \sum_{i \in I} c_i(y_i) \quad \text{s.t.} \quad y \in Y, \quad \sum_{i \in I} h_i(y_i) = 0$$

- y Decision variables of all players
- Y Cartesian product of individual feasible sets

Existence of Equilibria





Lagrangian Dual Problem of the (WFP)

$$\min_{y} \sum_{i \in I} c_i(y_i) \quad \text{s.t.} \quad y \in Y, \quad \sum_{i \in I} h_i(y_i) = 0 \quad (WFP)$$

$$\sup_{\pi} d(\pi) := \inf_{y \in Y} L(y, \pi) = \sum_{i \in I} \left(c_i(y_i) + \pi^T h_i(y_i) \right) \quad (\mathsf{LD-WFP})$$

Theorem (See Part 1. of Theorem 2.3 in Harks (2020))

The pair (y^*, π^*) is a market equilibrium of (MEP) if and only if y^* and π^* are solutions of the welfare optimization problem (WFP) and the corresponding dual problem (WFP-LD), respectively, with zero duality gap.



Implications

Corollary

(a) If (y*, π*) is an equilibrium of (MEP), then y* is a global solution of (WFP).
(b) If y* is a global solution of (WFP), for which there exists no π such that (y*, π) is an equilibrium of (MEP), then (MEP) has no solution.
(c) If (y*, π*) and (ŷ, π̂) are equilibria of (MEP), then so are (y*, π̂) and (ŷ, π*).



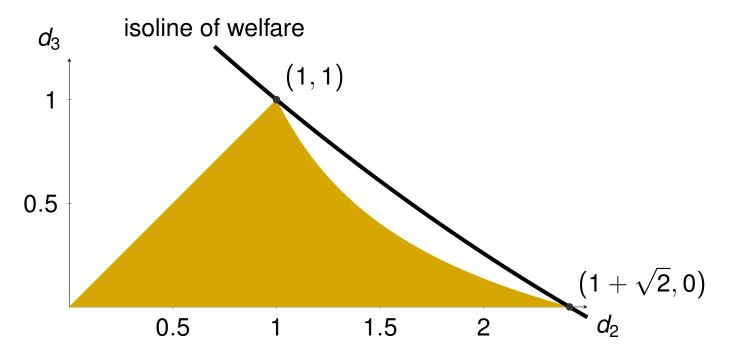
Players with Unique Best-responses

Corollary

Let S ⊆ I be those players with unique best responses for all price vectors.
(a) If (y*, π*) and (ŷ, π̂) are equilibria of (MEP), then y_S* = ŷ_S.
(b) If y* and ŷ are global solutions of (WFP) with y_S* ≠ ŷ_S, then (MEP) does not have a solution.



Example: Non-existence due to Strictly Convex Players



from Grimm et al. (2019)



Equilibrium Price Candidate Set $\Pi(y^*) \subseteq \mathbb{R}^{n_{\pi}}$

$$(y^*, \pi^*)$$
 is a market equilibrium of (MEP) $\implies \pi^* \in \Pi(y^*)$

<u>Goal</u>: Reduce candidate set to critical price vector $\hat{\pi}$!

$$\pi_k^- := \inf_{\pi \in \Pi(y^*)} \pi_k$$
 and $\pi_k^+ := \sup_{\pi \in \Pi(y^*)} \pi_k$ for all $k \in \{1, \dots, n_\pi\}$



Identification of Critical Price Vector

Theorem

Let y^* be a solution of the (WFP) and let $\Pi(y^*) \neq \emptyset$ be given. Assume that for all $k \in \{1, ..., n_\pi\}$ at least one of the following properties is satisfied: (a) $\pi_k^- = \pi_k^+$, (b) $\pi_k^+ < \infty$ and $(h_i(y_i^*))_k \leq (h_i(y_i))_k$ for all $y_i \in Y_i$ and all $i \in I$, (c) $\pi_k^- > -\infty$ and $(h_i(y_i^*))_k \geq (h_i(y_i))_k$ for all $y_i \in Y_i$ and all $i \in I$, (d) $\pi_k^- = -\infty, \pi_k^+ = \infty$ and $(h_i(y_i^*))_k = (h_i(y_i))_k$ for all $y_i \in Y_i$ and all $i \in I$. Then there exists an equilibrium of (MEP) if and only if $(y^*, \hat{\pi})$ is an equilibrium, where $\hat{\pi}$ is defined as

$$\pi_k := \begin{cases} \pi_k^- = \pi_k^+, & \text{if (a) applies,} \\ \pi_k^+, & \text{if (b) applies,} \\ \pi_k^-, & \text{if (c) applies,} \\ 0, & \text{if (d) applies.} \end{cases}$$

 $\hat{\pi}$

Energy Market Applications and Numerical Results





Application "Nonlinear Stationary Gas Flow"

$$f_{\text{TSO}}(q) = \sum_{u \in V_- \cup V_+} \pi_u \left(\sum_{a \in \delta^-(u)} q_a - \sum_{a \in \delta^+(u)} q_a \right) - \sum_{a \in A} \alpha q_a q_a$$
$$(p_v) - (p_w)$$
$$p_v^2 - p_w^2 = \Lambda |q| q,$$
$$p_v^- \leq p_v \leq p_v^+, \quad p_w^- \leq p_w \leq p_w^+$$

- Λ Computed from gas and pipe parameters
- *q* Gas flow
- *p* Gas pressure



Test Instances for Application "Gas Physics"

- "GasLib A Library of Gas Network Instances" from Schmidt et al. (2017)
- "Global Optimization for the Multilevel European Gas Market System with Nonlinear Flow Models on Trees" from Schewe et al. (2021)

Instance	V	<i>V</i> _	$ V_+ $	A	#scenarios	α
GasLib-11 D5	11	3	3	10	12	{0.01, 0.05, 0.1}
GasLib-11	11	3	3	11	20	{0.01, 0.05, 0.1}
GasLib-24	22	4	3	23	20	{0.01, 0.05, 0.1}
GasLib-134	123	41	3	122	20	{0.01, 0.05, 0.1}
GasLib-134 TC	134	45	3	133	20	$\{0.01, 0.05, 0.1\}$



Numerical Results for Application "Gas Physics"

# instances	276
# instances solved within time limit	243
# instances with market equilibrium	243



Application "DC Line Switching"

$$f_{\text{TSO}}(q, x) = \sum_{u \in V_{-} \cup V_{+}} \pi_{u} \left(\sum_{a \in \delta^{-}(u)} q_{a} - \sum_{a \in \delta^{+}(u)} q_{a} \right) - \sum_{a \in A} \alpha q_{a} q_{a} - \sum_{a \in A_{s}} \beta(1 - x_{a})$$

$$(\theta_{v}) - q_{w} = -\frac{1}{B}q_{v} \qquad (\theta_{v}) - \frac{q_{w}}{X} - \theta_{w} = 0$$

$$q^{-} \leq q \leq q^{+} \qquad (\theta_{v} - \theta_{w} + \frac{1}{B}q)(1 - x) = 0, \quad qx = 0$$

- *B* Computed from pipe parameters
- q, θ Electricity flow, phase angle
 - *x* Switching variable (0 on, 1 off)



Test Instances for Application "DC Line Switching"

- "MATPOWER (Version 7.1)" from Zimmerman and Murillo-Sanchez (2020)
- 10% of all arcs are randomly selected as being switchable
- 42 scenarios in total
- Transport costs $\alpha \in \{0.1, 0.5, 1.0\}$
- Switching costs $\beta \in \{20, 50\}$

Instance	V	<i>V</i> _	$ V_+ $	A
Smallest	5	3	4	6
Average	2362	1246	405	3304
Biggest	13659	5043	4092	20467



Numerical Results for Application "DC Line Switching"

# instances	252
# instances solved within time limit	211
# instances with market equilibrium	121

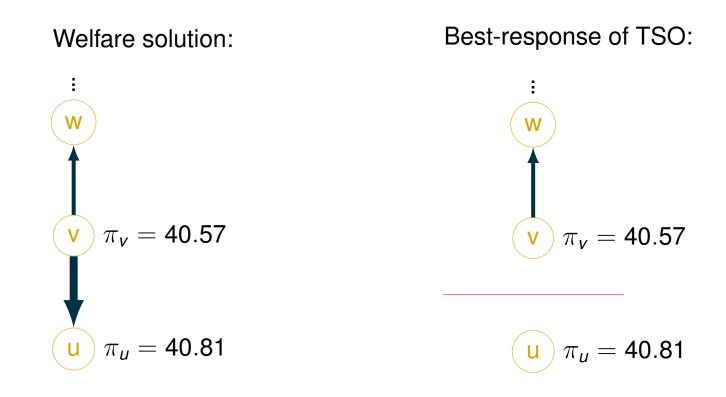
Observations

It becomes more likely that an equilibrium exists with ...

- ... decreasing number of nodes
- ... increasing transport costs
- ... increasing switching costs



Example: Switched-off vs. Switched-on Consumers



Conclusion





Summary

Answers to the central research questions

Given an energy market game with nonconvexities.

1. Can we decide existence of a competitive market equilibrium?

- •
- •
- •
- 2. How often exist equilibria for respective applications?
 - •
 - •



Summary

Answers to the central research questions

Given an energy market game with nonconvexities.

- 1. Can we decide existence of a competitive market equilibrium?
 - Uniqueness / non-existence result for MEPs that include strictly convex players
 - Identification of critical price vector for specific types of MEPs occuring, e.g., in transportation networks
 - Algorithmic approach that decides existence of equilibrium and computes an equilibrium in case of existence
- 2. How often exist equilibria for respective applications?
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1. Can we decide existence of a competitive market equilibrium?

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- Identification of critical price vector for specific types of MEPs occuring, e.g., in transportation networks
- Algorithmic approach that decides existence of equilibrium and computes an equilibrium in case of existence
- 2. How often exist equilibria for respective applications?
 - · Gas physics: Always
 - DC line switching: About 50% of cases



Thank you for your attention!

Questions + Answers