Usage of Game-Theory in Energy, Cyber Security and COVID-19

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Speaker background

Dr Luluwah Al-Fagih is an Assistant Professor in the Division of Engineering Management and Decision Sciences at Hamad Bin Khalifa University (HBKU), Qatar. Prior to joining HBKU, Dr Al-Fagih was a Senior Lecturer in the School of Computer Science and Mathematics at Kingston University London. Dr Al-Fagih holds a PhD in Financial Mathematics from The University of Manchester, UK and a BSc and MSc in Mathematics and Financial Mathematics from King's College London. She joined Kingston University as a Lecturer in 2013. Over the last few years, Dr Al-Fagih has developed research in Game Theory and its applications to smart energy management, cyber security and more recently, pandemics such as COVID-19.

Outline

- Game theory introduction
- Energy scheduling game
- COVID-19 Personal Protective Equipment (PPE) game



Game Theory Applications

- **Biology**: Evolutionary games, signalling games to study animal communication
- **Philosophy**: Answering questions about common knowledge between different individuals and consequences
- **Computer science:** Design of peer-to-peer systems
- Auctions: English auction, double auctions, or second-price auctions
- **Politics**: Design and analyse voting schemes



Game-Theoretic Approaches to Storage Scheduling in Prosumer Communities

Joint work with Matthias Pilz

Other collaborators: Jean-Christophe Nebel, Eckhard Pfluegel, Mastaneh Davis, Fariborz Baghaei



Demand-Side Management Schemes

- Control of consumption by the utility company at the consumer side
- Consumers can be incentivised to decrease consumption from grid during peak times, i.e. lower the peak-to-average ratio (PAR)
- Can include load shifting, i.e. operating household appliances at off-peak times, but this <u>interferes</u> with consumers' habits and comfort levels
- Battery scheduling can achieve same net effect without interfering with consumer habits
- Relies on the two-way communication of the future smart grid

The System Model

- Prosumers = Producers + consumers
- Two-way power flow and two-way communication (via smart meter)
- Load on grid = household demand + battery activity
- Divide following day into intervals
- Time-of-use tariff
 - different price for each interval
 - based on aggregated load
- Proportional billing





The Scheduling Game

• Players

- households with varying demand

• Actions

- day-ahead schedules of battery usage

- A B
- Payoff
 - individual energy bill



Nash Equilibrium schedules



- Reduction of peak-to-average (PAR) ratio > 14 %
- Energy cost reduction > 6.5 %
- High demand users use their battery the most



Community with non-participants & forecasting errors



Pilz, M. and Al-Fagih, L. A Dynamic Game approach for Demand-Side Management: Scheduling Energy Storage with Forecasting Errors. *Dynamic Games and Applications (Springer) 2019.*

Is it worth playing the game?



Pilz, M., Nebel, J.C. and Al-Fagih, L. A Practical Approach to Energy Scheduling: A Game Worth Playing? 2018 IEEE PES Innovative Smart Grid Technologies Conference Europe (ISGT-Europe). Sarajevo, Bosnia-Herzegovina.

False Data Injection Attacks



Pilz, M., Baghaei Naeini, F., Grammont, K., Smagghe, C., Davis, M., Nebel, J.C., Al-Fagih, L., Pfluegel, E. Security Attacks on Smart Grid Scheduling and Their Defences: A Game–Theoretic Approach. *International Journal of Information Security* (Springer). 2019.

Game Theory to Enhance Stock Management of Personal Protective Equipment (PPE) Supply during the COVID-19 Outbreak

with Khaled Abedrabboh, Matthias Pilz, Zaid Al-Fagih, Othman S. Al-Fagih and Jean-Christophe Nebel



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The problem



- Initial data early in the pandemic showed that 10-20% of Covid-19 cases found in healthcare workers (HCWs)
- 20% of inpatient & 89% of HCW cases caught in hospitals

Every month, frontline health responders around the world need these supplies (and more) to protect themselves and others from #COVID19





The PPE Challenge

- The higher the aggregated demand, the more challenging it is to fulfil due to:
 - sourcing new suppliers, higher shipping costs
 - increased production (overtime, extra staff and/or equipment)
 - higher demand -> higher costs.
- The daily aggregated demand should be minimal and 'constant', otherwise there would be a supply issue!

Proposed system architecture

- PPE supply chain
- Centralised decentralised



The PPE Game

• Players:



- Seven regions of NHS (National Health Service) England
- Actions:
 - Each region to schedule their daily PPE orders for the whole period
- Goal:
 - Each player attempts to get PPE at the lowest cost while still meeting their full demand

Questions

- Early stockpiling
 - Would it have eased the challenge of securing PPE ? If yes, how early ?
- Storage space
 - Are the current storage capacities enough ? How much more space is required ?
- Second wave
 - How early a second wave of PPE demand can be handled with this game ?





Data and experimental setup

- Occupied hospital beds with COVID-19 illness is representative of how much a hospital is responding to the pandemic.
- Bed occupation data publicly available for the 7 NHS (National Health Service) England regions
- Changes in NHS guidelines, e.g. 2nd April, 'Sessional' use of PPE: the same clothing could be used throughout one shift instead of solely for one patient





Experimental implementation

- Early stockpiling dates:
 - 20 March 2020: data on COVID-19 cases and occupied hospital beds in England made public
 - 2. 11 March 2020: WHO declared COVID-19 a pandemic
 - **3. 28 February 2020**: European Union proposed bulk-buy PPE scheme to UK
 - 4. 07 February 2020: WHO warned of PPE shortages
 - 5. 31 January 2020: First COVID-19 case confirmed in the UK
- Storage capacities: 5 values (no additional capacity, 5x, 10x, 15x and 20x original capacity)
- Estimates for peak of second wave: 5 values from October 2020 to February 2021

An example simulation of stockpiling game

- Stockpiling started on 28 Feb 2020
- Standard storage capacity multiplied by 5
- Peak of second wave expected to happen in mid October 2020



Millions of PPE sets required daily nationally (dotted line), ordered daily nationally (bold line) according to the game, and stored in each of the 7 regions

Results



Challenge in terms of fulfilling PPE demand delivery according to the amount of available storage capacity (x-axis), the stockpiling starting date in 2020 (y-axis), and the peak date of a putative second wave of COVID-19 (each cell in the grid is divided in five stripes corresponding, from top to bottom, to peak dates in October, November, December 2020, January and February 2021).





Challenge in terms of fulfilling PPE demand delivery according to the amount of available storage capacity (x-axis) and the peak date of a putative second wave of COVID-19 (y-axis).

Conclusion

- PPE shortages can be avoided by installing temporary storage space such as marquees. Increasing PPE storage capacity by a factor of 15 would have been required to minimise the pressure on the NHS
- Early stockpiling could ease the challenge significantly
- Looking ahead, steady stockpiling is still a more viable option than panic buying
- Could have delivered cost savings of 38% had stockpiling begun on February 7 (the date WHO warned of PPE shortages)
- Read about this work on **Forbes**!

Related publications

- Pilz, M., Al-Fagih, L. A Dynamic Game Approach for Demand-Side Management: Scheduling Energy Storage with Forecasting Errors. *Dyn Games Appl* 10, 897–929 (2020). <u>https://doi.org/10.1007/s13235-019-00309-z</u>
- M. Pilz, J. Nebel and L. Al-Fagih, A Practical Approach to Energy Scheduling: A Game Worth Playing?, 2018 IEEE PES Innovative Smart Grid Technologies Conference Europe (ISGT-Europe), <u>https://doi.org/10.1109/ISGTEurope.2018.8571522</u>
- Pilz, M., Naeini, F.B., Grammont, K. *et al.* Security attacks on smart grid scheduling and their defences: a game-theoretic approach. *Int. J. Inf. Secur.* **19**, 427–443 (2020). <u>https://doi.org/10.1007/s10207-019-00460-z</u>
- Abedrabboh K, Pilz M, Al-Fagih Z, Al-Fagih OS, Nebel J-C, Al-Fagih L (2021) Game theory to enhance stock management of Personal Protective Equipment (PPE) during the COVID-19 outbreak. PLoS ONE 16(2) <u>https://doi.org/10.1371/journal.pone.0246110</u>