# Scopus

# **Documents**

Aminuddin, W.M.W.M., Ismail, W.R., Harunarashid, H.

Resources improvement in emergency department using simulation and data envelopment analysis [Penambahbaikan sumber jabatan kecemasan menggunakan kaedah simulasi dan analisis pengumpulan data] (2018) Sains Malaysiana, 47 (9), pp. 2231-2240. Cited 1 time.

DOI: 10.17576/jsm-2018-4709-34

Pusat Pengajian Sains Matematik, Fakulti Sains dan Teknologi, Universiti Kebangsaan Malaysia, UKM Bangi, Selangor Darul Ehsan, 43600, Malaysia

#### **Abstract**

The Emergency Department of Universiti Kebangsaan Medical Centre (PPUKM) receives a high number of patients daily resulted in numerous problems particularly overcrowding. Therefore, this study is designed to identify the best optimization model that improve resources in order to improve the efficiency level of the PPUKM Emergency Department and solve the overcrowding problem. Simulation technique is used to build a simulation model of the emergency department where the variables used in the model are specified by triage zones or treatment areas. The proposed alternative improvements contains a new configuration of department resources. Six combined models used are the CCR Model and Reference Set, BCC Model and Reference Set, CCR Model and Super-Efficiency, BCC Model and Super-Efficiency, Bi-Objective MCDEA-CCR Model and Cross-Efficiency, Bi-Objective MCDEA-BCC Model is a continuation of Bi-Objective MCDEA-BCC Model from previous studies. The results showed that the Bi-Objective MCDEA-BCC Model has derived the least number of efficient alternative improvements compared to other combined models. It also suggested an optimum alternative that can reduce the patient waiting time in the Green Zone by 51% while the percentage of resource utilisation has been improved to be more reasonable. This alternative needs redesigning the department's resources without making major changes to the original system. © 2018 Penerbit Universiti Kebangsaan Malaysia. All rights reserved.

### **Author Keywords**

Data Envelopment Analysis; Emergency department; Overcrowding; Resource optimisation; Simulation

#### **Index Keywords**

computer simulation, data envelopment analysis, hazard assessment, hospital sector, optimization, overcrowding, resource management

# References

Aboukanda, E., Latif, M.

Exploiting simulation to reduce patient waiting time using a streaming strategy in an emergency department

(2013) International Journal of Advanced Technology & Engineering Research, 3 (2), pp. 79-86.

- Aiken, H.L., Charles, S.P., Sloane, D.M., Sochalski, J., Silber, S.H.
   Hospital nurse staffing and patient mortality, nurse burnout and job dissatisfaction (2002) *JAMA*, 288 (16), pp. 1987-1993.
- Al-Refaie, A., Fouad, R.H., Li, M., Shurrab, M.
   Applying simulation and DEA to improve performance of emergency department in a Jordanian hospital

(2014) Simulation Modelling Practice and Theory, 41, pp. 59-72.

Aminuddin, W.M.W.M., Ismail, W.R., Harunarashid, H., Ali, R.A., Ismail, M.S., Johar, M. Utilization of Emergency Department, UKM Medical Centre: Pattern of patient (2016) *Jurnal Teknologi*, 4, pp. 53-58.

- Andersen, P., Petersen, N.
   A procedure for ranking efficient units in data envelopment analysis (1993) *Management Science*, 39 (10), pp. 1261-1264.
- Ansari, Z.M., Yasin, H., Zehra, N., Faisal, A.
   Occupational stress among Emergency Department (ED) staff and the need for invesment in health care; A view from Pakistan
   (2015) British Journal of Medicine & Medical Research, 10 (10), pp. 1-9.
- Azadeh, A., Sepahi, M., Haghighi, S.M.
   An integrated simulation-DEA approach to improve quality care of medical centres (2013) Int. J. Process Management and Benchmarking, 3 (3), pp. 352-370.
- Azaiez, M.N., Al-Sharif, S.
   A 0-1 goal programming model for nurse scheduling
   (2005) Computers & Operations Research, 32 (3), pp. 491-507.
- Azlan, N., Saibon, I.M., Azizol, M.
   Management of emergency department overcrowding (EDOC) in a teaching hospital (2013) Med. & Health, 8 (1), pp. 42-46.
- Bal, H., Orkc, H.H.
   Improving the discrimination power and weights dispersion in the data envelopment analysis
   (2010) Computers & Operations Research, 37 (1), pp. 99-107.
- Banker, R., Charnes, A., Cooper, W.
   Some models for estimating technical and scale inefficiencies in data envelopment analysis
   (1984) Management Science, 30 (9), pp. 1078-1092.
- Brailsford, S.C.
   Tutorial: Advances and challenges in healthcare simulation modeling
   (2007) Proceeding of The 2007 Winter Simulation Conference, pp. 1436-1448.
- Carmen, R., Defraeye, M., Van Nieuwenhuyse, I.
   A decision support system for capacity planning in emergency departments (2015) Int. J. Simul. Model, 14 (2), pp. 299-312.
- Carrilloa, M., Jorge, J.M.
   A multiobjective DEA approach to ranking alternatives
   (2015) Expert Systems With Applications, 12, pp. 1-27.
- Carson, J.S.
   Model verification and validation
   (2002) Proceeding of The 2002 Winter Simulation Conference, pp. 52-58.
- Carter, M.W., Lapierre, S.D.
   Scheduling emergency room physicians
   (2001) Health Care Management Science, 4 (4), pp. 347-360.
- Centeno, M.A., Giachetti, R., Linn, R., Ismail, A.M.
   A simulation-ILP based tool for scheduling ER staff
   (2003) Proceeding of The 2003 Winter Simulation Conference, pp. 1930-1938.

- Charnes, A., Cooper, W., Rhodes, E.
   Measuring the efficiency of decision making units
   (1978) European Journal of Operational Research, 2 (6), pp. 429-444.
- Cooper, W., Seiford, L., Tone, K.
   (2007) Data Envelopment Analysis, New York: Springer
- Cowan, R.M., Trzeciak, S.
   Clinical review: Emergency department overcrowding and the potential impact on the critically ill (2005) Critical Care, 9 (3), pp. 291-295.
- Di, S., Lorenzo, S., Vaughan, L., Lalle, I., Magrini, L., Magnanti, M.
   Overcrowding in emergency department: An international issue (2015) *Intern Emerg. Med.*, 10 (2), pp. 171-175.
- Doyle, J., Green, R.
   Efficiency and cross-efficiency in DEA: Derivations, meanings and uses (1994) Journal of The Operational Research Society, 45 (5), pp. 567-578.
- Emrouznejad, A.
   (2012) Data Envelopment Analysis Homepage,
- Eskandari, H., Riyahifard, M., Khosravi, S., Geiger, C.D.
   Improving the emergency department performance using simulation and MCDM methods
   (2011) Proceeding of 2011 Winter Simulation Conference, pp. 1211-1222.
- Francisco, A., Augusto, F., Marins, S., Tamura, P.M., Dias, E.X.
   Bi-Objective multiple criteria data envelopment analysis combined with the overall equipment effectiveness: An application in an automotive company (2017) *Journal of Cleaner Production*, 157, pp. 278-288.
- Gharahighehi, A., Kheirkhah, A.S., Bagheri, A., Rashidi, E.
   Improving performances of the emergency department using discrete event simulation, DEA and the MADM methods
   (2016) Digital Health, 2, pp. 1-14.
- Ghasemi, M., Ignatius, J., Emrouznejad, A.
   A bi-objective weighted model for improving the discrimination power in MCDEA (2014) European Journal of Operational Research, 233 (3), pp. 640-650.
- Holm, L.B., Luras, H., Dahl, F.A.
   Improving hospital bed utilisation through simulation and optimisation (2013) *International Journal of Medical Informatics*, 82 (2), pp. 80-89.
- Horwitz, L.I., Green, J., Bradley, E.H.
   US emergency department performance on wait time and length of visit (2010) Annals Of Emergency Medicine, 55 (2), pp. 133-141.
- Jeenanunta, C., Ayudhya, S.I.N., Doungraksa, P., Sereewattanapong, C., Pongtanupattana, A., Intalar, N.
   Resource analysis in emergency department using simulation-based framework (2013) 4th International Conference on Engineering Project and Production Management, pp. 1073-1083.

- Jun, J., Jacobson, S., Swisher, J.
   Application of discrete-event simulation in health care clinics: A survey (2013) *Journal of The Operational Research Society*, 50 (2), pp. 109-123.
- Kelton, W.D., Sadowski, R.P., Swets, N.B. (2010) Simulation with Arena, New York: McGraw-Hill
- Li, X., Reeves, G.R.
   A multiple criteria approach to data envelopment analysis
   (1999) Engineering and Technology Management, 115, pp. 507-517.
- Lv, X., Li, L., Xu, W., Rong, X.
   Sufficient and comprehensive measurement of multi-band camouflage screen performance applying bi-objective super-efficiency dea (2015) The 10th International Conference on Computer Science & Education, pp. 542-546.
- (2012) Emergency Medicine and Trauma Services Policy, Diakses pada 5 Disember 2015
- Moashiri, H., Aljunid, S.M., Amin, R.M., Dahlui, M., Ibrahim, W.N.
   Measuring efficiency of teaching hospital in Malaysia
   (2011) International Journal of Business and Management, 6 (4), pp. 207-213.
- Meza, L.A., Lins, M.P.E.
   Review of methods for increasing discrimination in data envelopment analysis (2002) Annals of Operations Research, 116 (1-4), pp. 225-242.
- Paul, S.A., Reddy, M.C., Deflitch, C.J.
   A systematic review of simulation studies investigating emergency department overcrowding
   (2010) Simulation, 86 (8-9), pp. 559-571.
- Redeker, G.A., Webber, T., Czekster, R.M., Quickert, S., Bowles, J.K.F.
   Estimating capacity and resource allocation in healthcare settings using business process modelling and simulation

   (2017) Anais XXXVII Congresso Da Sociedade Brasileira De Computação, pp. 5-8.
- Ruohonen, T., Neittaanmaki, P., Teittinen, J.
   Simulation model for improving the operation of the emergency department of special health care

   (2006) The Proceeding of 2006 Winter Simulation Conference, pp. 453-458.
- Sarkis, J.
   Comparative analysis of DEA as a discrete alternative multicriteria decision tool (2000) European Journal of Operational Research, 123 (3), pp. 543-557.
- Sexton, T.
   (1986) Measuring Efficiency: An Assessment of Data Envelopment Analysis, San Francisco: Jossey-Bass
- Somma, S.D., Paladino, L., Vaughan, L., Lalle, I., Magrini, L., Magnanti, M.
   Overcrowding in emergency department: An international issue (2015) Intern. Emerg. Med., 10 (2), pp. 171-175.

- Subramaniam, S.
   (2016) Kementerian Kesihatan Usaha Tangani Pengurangan Bajet,
   Diakses oleh 10 Ogos 2016
- Tahar, R.M.
   (2006) A Practical Approach to Computer Simulation Modelling,
   Serdang: Universiti Putra Malaysia Press
- (2016) Rancangan Malaysia Ke-Sebelas 2016-2020, Unit Perancang Ekonomi
- Uriarte, A.G., Zuniga, E.R., Moris, M.U., Ng, A.H.C.
   System design and improvement of an emergency department using simulation-based multi-objective optimization

   (2015) Journal of Physics, 1, pp. 1-11.
- Weng, S., Tsai, B.S., Wang, L.M., Chang, C.Y.
   Using simulation and data envelopment analysis in optimal healthcare efficiency allocations
   (2011) The Proceeding of 2011 Winter Simulation Conference, pp. 1295-1305.
- Yarmohammadian, M.H., Rezaei, F., Haghshenas, A., Tavakoli, N.
   Overcrowding in emergency departments: A review of strategies to decrease future challenges
   (2017) Journal of Research in Medical Sciences, 22 (1), p. 23.
- Zeinali, F., Mahootch, M., Sepehri, M.M.
   Resource planning in the emergency departments: A simulation-based metamodeling approach
   (2015) Simulation Modelling Practice and Theory, 53, pp. 123-138.

#### **Correspondence Address**

Ismail W.R.; Pusat Pengajian Sains Matematik, Malaysia; email: wrismail@ukm.edu.my

Publisher: Penerbit Universiti Kebangsaan Malaysia

**ISSN:** 01266039

**Language of Original Document:** Malay **Abbreviated Source Title:** Sains Malays.

2-s2.0-85056389158 **Document Type:** Article **Publication Stage:** Final

Source: Scopus

