

**A MICRO-GENETIC ALGORITHM APPROACH FOR SOFT
CONSTRAINT SATISFACTION PROBLEM IN UNIVERSITY
COURSE SCHEDULING**

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**This dissertation is submitted to the Centre for Graduate Studies to fulfill the
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Abstrak

Masalah penjadualan kursus universiti adalah kombinasi masalah pengoptimuman. Masalah adalah lebih mencabar apabila satu set peristiwa perlu dijadualkan dalam slot masa, akan ditempatkan ke bilik yang sesuai, yang tertakluk kepada beberapa set kekangan keras dan lembut. Kesemua kekangan yang wujud sebagai peraturan-peraturan dalam setiap sumber untuk peristiwa tersebut perlu dipenuhi untuk mencapai tugas yang optimum. Di samping itu, reka bentuk jadual kursus untuk universiti adalah tugas yang sangat sukar kerana ia merupakan satu permasalahan “non-deterministic polynomial”, (NP) keras. Masalah ini boleh dikurangkan dengan menggunakan pendekatan Algoritma Mikro Genetik. Pendekatan ini, mengekod perwakilan kromosom sebagai salah satu elemen penting untuk memastikan hanya sedikit bilangan kromosom individu yang tidak fisibel dihasilkan. Oleh itu, kajian ini mencadangkan pengekodan perwakilan kromosom menggunakan tatasusunan satu dimensi bagi menambahbaik pendekatan algoritma genetik mikro kepada masalah kekangan lembut dalam jadual kursus universiti. Sumbangan bagi kajian ini adalah dalam membangunkan perisian penjadualan yang efektif dan fisibel dengan menggunakan Algoritma Mikro Genetik yang mampu untuk mengurangkan pengeluaran kromosom individu yang tidak fisibel berbanding algoritma pengoptimuman sedia ada bagi jadual waktu kursus universiti, dimana data sampelnya ialah UNITAR International University. Algoritma Mikro Genetik yang dicadangkan telah diuji dalam ujian perbandingan dengan algoritma genetik biasa dan carian berpanduan kepada algoritma genetik sebagai penanda aras. Keputusan menunjukkan bahawa algoritma yang dicadangkan mampu untuk menjana bilangan minimum kromosom individu yang tidak fisibel. Keputusan eksperimen juga menunjukkan bahawa Algoritma Mikro Genetik mampu untuk menghasilkan jadual kursus terbaik untuk UNITAR International University.

Kata kunci: Mikro Genetik, Kekangan lembut, Pengoptimuman, Penjadualan

Abstract

A university course timetabling problem is a combination of optimization problems. The problems are more challenging when a set of events need to be scheduled in the time slot, to be located to the suitable rooms, which is subjected to several sets of hard and soft constraints. All these constraints that exist as regulations within each resource for the event need to be fulfilled in order to achieve the optimum tasks. In addition, the design of course timetables for universities is a very difficult task because it is a non-deterministic polynomial, (NP) hard problem. This problem can be minimized by using a Micro Genetic Algorithm approach. This approach, encodes a chromosome representation as one of the key elements to ensure the infeasible individual chromosome produced is minimized. Thus, this study proposes an encoding chromosome representation using one-dimensional arrays to improve the Micro Genetic algorithm approach to soft constraint problems in the university course schedule. The research contribution of this study is in developing effective and feasible timetabling software using Micro Genetic Algorithm approach in order to minimize the production of an infeasible individual chromosome compared to the existing optimization algorithm for university course timetabling where UNITAR International University have been used as a data sample. The Micro Genetic Algorithm proposed has been tested in a test comparison with the Standard Genetic algorithm and the Guided Search Genetic algorithm as a benchmark. The results showed that the proposed algorithm is able to generate a minimum number of an infeasible individual chromosome. The result from the experiment also demonstrated that the Micro Genetic Algorithm is capable to produce the best course schedule to the UNITAR International University.

Keyword : Micro Genetic, Soft constraint, Optimization, Timetabling

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CHAPTER 1

INTRODUCTION

In general, a university course timetabling problem usually refers to finding the exact allocated time within a limited time period for example a week, for a number of events (courses-lectures) and assignment of events to a number of resources (lecturers-rooms) in such a way that a number of constraints are satisfied.

Yang and Petrovic (2004) has defined the timetabling as the allocation of a set of subject into a classroom over a limited number of time periods to avoid the occurrence of conflicts of interests between two subjects or lecturers. A good scheduling technique that can lead to optimization is important to ensure it is able to produce all timetable for students and lecturers.

The main problem in the university timetable generation is to provide lecturers and lecture activities by matching all lectures involving the consumption a lot of time as well as the person responsible. The information required for the course schedule including room availability, time slots and several specific policy options. For example, information on room availability can be specified to the room capacity for certain events. In the domain of university timetable, it is often used to refer to the construction of schedule (with time slots) through the system by considering several numbers of constraints.

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REFERENCES

- Abdullah, S., and Hamdan, A. R. (2008). A Hybrid Approach for University Course Timetabling, *The International Journal of Computer Science and Network Security*, Universiti Kebangsaan Malaysia, 8 (8), 127-132.
- Abu-Lebdeh, G., and Benekohal, R.F. (1999). Convergence Variability and Population Sizing in Micro-Genetic Algorithms, *Computer-Aided Civil and Infrastructure Engineering*, Vol.14, No.5, pp. 321-334.
- Abdullah, S., and Turabieh, H. (2008). Generating University Course Timetable using Genetic Algorithm and Local Search. A Proceeding Paper for the 3rd International Conference on Convergence and Hybrid Information Technology 2008, A Publication of IEEE, 254 – 260.
- Abdullah, S., Turabieh, H., McCollum, B., and Burke, E. K. (2009). An Investigation of Genetic Algorithm and Sequential Local Search Approach for Curriculum-based Course Timetabling Problems, in *Proc. Multidisciplinary International Conference on Scheduling: Theory and Applications (MISTA 2009)*, Dublin, Ireland (2009), pp.727-731.
- Adamis, P., and Arapakis, P. (1999). Evolutionary Algorithms in Lecture Timetabling. *Proceedings of the 1999 IEEE Congress on Evolutionary Computation (CEC '99)*, IEEE, 1999, 1145-1151.
- AlSharafat, W.S., and AlSharafat, M.S. (2010). "Adaptive Steady Genetic Algorithm for Scheduling University Exams," in *Proc. International Conference on Networking and Information Technology (ICNIT)*, pp. 70-74.

- Azimi, Z.N. (2004). Comparison of Metaheuristic Algorithms for Examination Timetabling Problem. *Journal of Mathematics and Computing* 16, 337–354.
- Beasley, J.E., and Chu, P.C. (1996). A genetic algorithm for the set covering problem. *European Journal of Operation Research*, 94(2), 392-404.
- BI WeiHong, REN HongMin and WU QingBiao (2006). A New Elitist Strategy in Genetic Algorithms. *Journal of Zhejiang University(Science Edition)*, 32-35.
- Brailsford, S. C., Potts, C. N., and Smith, B. M. (1999). Constraint Satisfaction Problems: Algorithms and Applications. *European Journal of Operational Research*, 119, 557-581.
- Burke, E. K., and Newall, J.P. (1999). Multistage Evolutionary Algorithm for the Timetable Problem. *IEEE Transactions on Evolutionary Computation*, 63-74.
- Carter, M. W. (1986). A Survey of Practical Applications of Examination Timetabling Algorithms. *Operation Research*, 34, 193-202.
- Carter, M. W., Laporte, G., and Lee, S.Y. (1996). Examination Timetabling: Algorithmic Strategies and Applications. *Journal of Operational Research Society*, 43(3), 373-383.
- Coello, C. A., and Pulido, G. T. (2001). A Micro-genetic algorithm for multi-objective optimization. In Zitzler, E., Deb, K., Thiele, L., Coello, C. A. C., and Corne, D. W., editors, *First International Conference on Evolutionary Multi-Criterion Optimization*, pages 126–140. SpringerVerlag, Berlin.
- Colomi, A., Dorigo, M., and Maniezzo, V. (1990). Genetic Algorithms – A New Approach to the Timetable Problem. In *Lecture Notes in Computer Science – NATO ASI Series*, F(82), 235-239.

- Davis F. D. (1989), Perceived usefulness, perceived ease of use, and user acceptance of Information Technology.: MIS Quarterly (13 : 3).
- Eiben, A.E., Hinterding, R., and Michalewicz,Z. (1999) “Parameter control in evolutionary algorithms,” IEEE Trans. Evol. Comput., vol. 3, no. 2, pp. 124–141.
- Filho, G. R., and Lorena, L. A. N. (2000). A Constructive Evolutionary Approach To School Timetabling. www.lac.inpe.br/~marcos/arsig2/CGA-timet-EVOCOP.pdf
- Garey, M. R., and Johnson, D. S. Computers and Intractability.(1979).A guide to NP-Completeness. W.H. Freeman and Company, San Francisco, 179.
- Gen, M., and Cheng, R. (1994). Evolution Program for Resource Constrained Project Scheduling Problem. In Proceedings of the first IEEE conference on evolutionary computation, 736-741.
- Goldberg, D. E. (1989).Genetic Algorithms in Search, Optimization and Machine Learning, Kluwer Academic Publishers, Boston, MA.
- Goldberg, D. E. (1989).Sizing populations for serial and parallel genetic algorithms, in Proceedings of the 3rd International Conference on Genetic Algorithms, Fairfax, V.I., 70–79.
- Golub, M., Kasapovic, S. (2002). Scheduling Multiprocessor Tasks with Genetic Algorithms. Proceeding of the IASTED International Conference Allplied Infomatics, Insbruck, Austria, 273-278.
- Gy’ori, S. Petres, Z., and Varkonyi-Koczy, A. R. (2001). Genetic Algorithms in Timetabling. A New Approach. MFT Periodika 2001-07. Hungarian Society of IFSA, Hungary.

- Heitkoetter, J., and Beasley, D. (2001). The Hitch-Hiker's Guide to Evolutionary Computation: A list of Frequently Asked Questions (FAQ).
- Jat, S. N and Yang, S. (2009). "A guided search genetic algorithm for the university course timetabling problem," in Proc. 4th Multidisciplinary Int. Conf. Scheduling: Theory Appl., pp. 180–191.
- Jat, S. N and Yang, S. (2011). "Genetic Algorithms and Local Search Strategies for University Course Timetabling," IEEE Transactions on Systems, Man, and Cybernetics, Part C: Applications and Reviews, Vol. 41, no. 1, pp.93-106
- Joshua D. Knowles and David W. Corne. Approximating the Nondominated Front Using the Pareto Archived Evolution Strategy. Evolutionary Computation,8(2):149 172, 2000.
- Karova, M. (2004). Solving Timetabling Problems Using Genetic Algorithms. The proceeding of IEEE of the 27th International Spring Seminar on Electronics Technology, Bankja, Bulgaria.
- Kazarlis, S.A., Papadakis, S.E., Theocharis, J.B. and Petridis, V. (2001). Microgenetic algorithms as generalized hill-climbing operators for GA Optimization. IEEE Transaction on Evolutionary Computation, 5(3): 204.217.
- Khan, N. (2003). Population sizing in genetic and evolutionary algorithms. Chocago: University of Illinois at Urbana-Champaign.
- Krishnakumar, K. (1989). Micro-genetic algorithms for stationary and non-stationary function optimization. SPIE, Intelligent Control and Adaptive Systems, pp. 289-296.

Krzysztof Socha, Joshua Knowles and Michael Sampels (2002). A MAX-MIN Ant System for the University Course Timetabling Problem. Proceedings of the Third International Workshop on Ant Algorithms, 1-13, September 12-14.

Kwan, A.S.K., Kwan, R.S.K., and Wren, A. (1997). Driver scheduling using genetic algorithms with embedded combinatorial traits (Technical Report 97.30). United Kingdom: University of Leeds.

Lai Lien-Fu, Hsueh Nien-Lin, Huang Liang-Tsung and Chen Tien-Chun (2006), An Artificial Intelligence Approach to Course Timetabling, a publication from the Proceedings of the 18th IEEE International Conference on Tools and Artificial Intelligence (ICTAI'06), IEEE Computer Society, 0-7695-2728-0/06.

- Lalescu, L., and Badica, C. (2003). Timetabling Experiments Using Genetic Algorithms. Timetabling Experiments Using Genetic Algorithms, prezentata la TAINN'03, Canakkale, Turcia, 2003. Retrieved February, 2005, from http://software.ucv.ro/Cercetare/Inginerie_Software/inginerie_software.html.
- Michalewicz, Z. (1994). Genetic Algorithms + Data Structures = Evolution Programs (2nd ed.), Springer-Verlag.
- Najdpour, N., Feizi-Derakhshi, M.-R. (2010), A two-phase evolutionary algorithm for the university course timetabling problem, Software Technology and Engineering (ICSTE), 2010 2nd International Conference on ,2, 266-271.
- Newall, J. P. (1999). Hybrid Methods for Automated Timetabling, PhD Thesis, Department of Computer Science, University of Nottingham.
- Nia, M.B., and Alipouri, Y. (2009).Speeding Up the Genetic Algorithm Convergence Using Sequential Mutation and Circular Gene Methods, Intelligent Systems Design and Applications, ISDA '09. Ninth International Conference on , vol., no., pp.31-36, Nov. 30 2009-Dec. 2 2009.
- Nielson, J. (2006), Quantitative Studies : How many users to test Alertbox, citedon 3rd April 2009, fromhttp://www.useit.com/alertbox/quantitative_testing.html
- Paechter, B. Cumming, A. Norman, L., and Luchian, H.(2006). Extensions to a Memetic Timetabling System. In E.K Burke and PM Rosse, Eds., Proceedings of the 1st Inter. Conf. on the Practice and Theory of Automated Timetabling.
- Paechter, B., Cumming, A., Luchian, H., and Petriuc, M. (1994).Two Solutions to the General Timetable Problem Using Evolutionary Methods. IEEE World Congress on Computational Intelligence, 300-305.

- Paechter, B., Rossi-Doria, O., Blum, C., Knowles J., Sampels, M., and Socha, K.(2002). A Local Search for the Timetabling Problem, PATAT 2002 Proceedings of the 4th international conference on the Practice And Theory of Automated Timetabling, Gent, Belgium, 124-127.
- Perzina, R. (2007). "Solving Multicriteria University Timetabling Problem by a Self-adaptive Genetic Algorithm with Minimal Perturbation", ;in Proc. IRI, pp.98-103.
- Rich, D.C. (1996). A Smart Genetic Algorithm for University Timetabling, In: E. Burke, P. Ross (Eds.): PATAT'95, LNCS 1153, Springer-Verlag, 1996, 181-197.
- Sapru,V., Reddy, K., and Sivaselvan, B.(2010). "Time Table Scheduling Using Genetic Algorithms Employing Guided Mutation," in Proc. IEEE International Conference on Computational Intelligence and Computing Research (ICCIC), pp. 1-4.
- Sigl, B., Golub, M., Mornar, V. (2003). Solving Timetable Scheduling Problem Using Genetic Algorithms, Information Technology Interfaces, 2003.ITI 2003.Proceedings of the 25th International Conference, 519- 524.
- Selvi, R., Muthu, and Rajaram, R. (2011). Multiobjective optimization to provide service guarantees for window-constrained scheduling using Micro-genetic algorithm. Proceedings of the 2011 International Conference on Communication, 457-461.
- Vahid Lotfi, and Robert Cerveney, (1991). A Final Exam Scheduling Package. J. Opl Res. Soc. Vol. 42, 3, 205 – 216.
- Vaishnavi, V., and Kuechler, B. (2004). Design Research in Information Systems,AISWorldNet, <http://www.isworld.org/Researchdesign/drisISworld.htm>, 20February 2004, last updated 5 June 2005 (accessed 15 October, 2005).

- Valouxis, C., and Housos, E. (2000). Hybrid Optimization Techniques for the Workshift and Rest Assignment of Nursing Personnel. *Artificial Intelligence in Medicine*, 20, 155-175.
- White, G. W., and Chan, P. W. (2002). Towards Construction of Optimal Examination Timetables. *INFOR* 17, 219-229.
- Xie, S.T., and Pan, L.T. (2010). Selection of Machining Parameters Using Genetic Algorithms. The 5th International Conference on Computer & Education, Hefei, China. August, 24-27.
- YakhnoT., and Tekin, E. (2002). Application of Constraint Hierarchy to Timetabling Problems, *Proceedings of EurAsia-ICT 002*, Springer- Verlag.
- Yang, H., and Luo, D. (2009). Optimal Regional Bus Timetables Using Improved Genetic Algorithm. 2nd International Conference on Intelligent Computation Technology and Automation.
- Yang, Y., and Petrovic, S. (2004). A Novel Similarity Measure for Heuristic Selection in Examination Timetabling. In: Burke, E.K., Trick, M. (Eds.), *Selected Papers from the 5th International Conference on the Theory and Practice of Automated Timetabling (PATAT 2004) – The Theory and Practice of Automated Timetabling V*, Lecture Notes in Computer Science, vol. 3616. Springer, Berlin, 247–269.