## ขั้นตอนวิธีจัดกลุ่มกระบวนการที่ใช้พลังงานอย่างมีประสิทธิภาพสำหรับระบบแบบกระจาย



นายอนันต์ นิยม

วิทยานิพนธ์นี้เป็นส่วนหนึ่งของการศึกษาตามหลักสูตรปริญญาวิทยาศาสตรดุษฎีบัณฑิต สาขาวิชาวิทยาการคอมพิวเตอร์และเทคโนโลยีสารสนเทศ ภาควิชาคณิตศาสตร์และวิทยาการ คอมพิวเตอร์ คณะวิทยาศาสตร์ จุฬาลงกรณ์มหาวิทยาลัย ปีการศึกษา 2556

ลิขสิทธิ์ของจุฬาลงกรณ์มหาวิทยาลัย



# ENERGY-EFFICIENT PROCESS CLUSTERING ASSIGNMENT ALGORITHM FOR DISTRIBUTED SYSTEM

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A Dissertation Submitted in Partial Fulfillment of the Requirements

for the Degree of Doctor of Philosophy Program in Computer Science and

Information Technology

Department of Mathematics and Computer Science

Faculty of Science

Chulalongkorn University

Academic Year 2013

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Thesis Title **ENERGY-EFFICIENT PROCESS CLUSTERING** ASSIGNMENT ALGORITHM FOR DISTRIBUTED **SYSTEM** Ву Mr. Anan Niyom Field of Study Computer Science and Information Technology Thesis Advisor Associate Professor Peraphon Sophatsathit, Ph.D. Professor Chidchanok Lursinsap, Ph.D. Thesis Co-Advisor Accepted by the Faculty of Science, Chulalongkorn University in Partial Fulfillment of the Requirements for the Doctoral Degree \_\_\_\_\_Dean of the Faculty of Science (Professor Supot Hannongbua, Dr.rer.nat.) THESIS COMMITTEE Chairman

อนันต์ นิยม : ขั้นตอนวิธีจัดกลุ่มกระบวนการที่ใช้พลังงานอย่างมีประสิทธิภาพสำหรับ ระบบแบบกระจาย. (ENERGY-EFFICIENT PROCESS CLUSTERING ASSIGNMENT ALGORITHM FOR DISTRIBUTED SYSTEM) อ.ที่ปรึกษาวิทยานิพนธ์หลัก: รศ. ดร.พี ระพนธ์ โสพัศสถิตย์, อ.ที่ปรึกษาวิทยานิพนธ์ร่วม: ศ. ดร.ชิดชนก เหลือสินทรัพย์, 108 หน้า.

วิทยานิพนธ์นี้เสนอขั้นตอนวิธีจัดการที่ใช้พลังงานอย่างมีประสิทธิภาพสำหรับระบบจัด กำหนดการแบบกระจายสองขั้นตอนคือ ขั้นตอนแรกดำเนินการโดยระเบียบวิธี energy-efficient process clustering assignment (EPC) ซึ่งจัดการใช้พลังงานอย่างมีประสิทธิภาพในระหว่าง กระบวนการการประมวลผล, การเดินเครื่องเปล่า และ การส่งผ่านข้อมูลของแต่ละหน่วย ประมวลผล ขั้นตอนที่สองใช้ energy-sufficiency level assignment (ESL) ซึ่งเน้นลดเวลาที่ใช้ ในการจัดกำหนดการ โดยเฉพาะภารกิจที่จำเป็นต้องประมวลผลในหน่วยประมวลผลที่กำหนด เท่านั้น ในการทดลองได้จำลองสถานการณ์ให้ใกล้เคียงกับความเป็นจริง โดยกำหนดให้แต่ละ หน่วยประมวลผลมีความสามารถในการจัดการแต่ละภารกิจแตกต่างกัน อีกทั้งความต้องการ พลังงานของแต่ละหน่วยประมวลผลก็แตกต่างกันด้วย รวมถึงข้อจำกัดด้านพลังงานของแต่ละ หน่วยประมวลผล โดยเฉพาะหน่วยประมวลผลหลักที่ต้องมีพลังงานเพียงพอ สำหรับรอผลการ ดำเนินงานจากหน่วยประมวลผลย่อยอื่นๆ ด้วย จากการทดลองพบว่าระเบียบวิธี EPC ให้ผลรวม ของการใช้พลังงานในหน่วยประมวลผลอยู่ในเกณฑ์ที่ดี และขั้นตอนวิธี ESL ลดเวลาของการจัด กำหนดการได้ดีเมื่อเทียบกับขั้นตอนวิธีของงานวิจัยอื่น และให้พลังงานของการจัดกำหนดการที่ต่ำ อีกทั้งยังสามารถจัดกำหนดการในระบบที่มีพลังงานจำกัดได้อีกด้วยทำให้พลังงานรวมที่ใช้ลดตาม ไปด้วย

ภาควิชา

สาขาวิชา

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ปีการศึกษา 2556

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# # 5273888623 : MAJOR COMPUTER SCIENCE AND INFORMATION TECHNOLOGY KEYWORDS: DISTRIBUTED ASSIGNMENT ALGORITHM / DEPENDENT TASK GRAPH / PROCESSING UNIT / TASK SCHEDULING / ENERGY AWARE

> ANAN NIYOM: ENERGY-EFFICIENT PROCESS CLUSTERING ASSIGNMENT ALGORITHM FOR DISTRIBUTED SYSTEM. ADVISOR: ASSOC. PROF. PERAPHON SOPHATSATHIT, Ph.D., CO-ADVISOR: PROF. CHIDCHANOK LURSINSAP, Ph.D., 108 pp.

In this thesis, two scheduling algorithms for distributed scheduling assignment are proposed to address the issue on energy consumption. The first algorithm is an energy-efficient process clustering assignment (EPC) algorithm which aims at efficient energy consumption during process execution, system idling, and data transmission. The second algorithm is an energy-sufficiency level assignment (ESL) algorithm which aims at reducing scheduling time, in particular, tasks that can only be executed on some designated processing units. Simulation results showed that the EPC algorithm yielded satisfactory energy consumption during processes, while the ESL algorithm reduced task scheduling time and energy considerably in comparison with other existing algorithms. The proposed algorithms can also handle scheduling assignment under limited power supply. As a consequence, total energy consumption decreases.

Department:

Mathematics and

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Field of Study: Computer Science and

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Academic Year: 2013

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#### **ACKNOWLEDGEMENTS**

I would like to thank many people who helped me during my Ph.D. Firstly, my supervisors, Assoc. Prof. Dr. Peraphon Sophatsathit and Prof. Dr. Chidchanok Lursinsap who gave me for a lot of valuable ideas, inspiration and helpful advices. Thank Asst. Prof. Dr. Suphakant Phimoltares who is both teacher and brother to me and gave a lot of useful counsels. Thank Assoc. Prof. Suchada Siripant, Asst. Prof. Dr. Saranya Maneeroj and all AVIC members for their encouragement.

I would like to thank The Office of Higher Education Commission, Ministry of Education, Thailand, for the financial support.

Finally, special thanks to my family and Miss Prae Chirawatkul for their love and support.



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