

**A Web-Based Recommender System using Semantic Web
and Linked Data for Suggesting Supervisors
to Postgraduate Research Students**

Student: **TRUNG THANH DANG**

CFS username: **TTD2**

DISSERTATION

Supervisor: **Dr. Monika Solanki**

Second Marker: **Prof. Thomas Erlebach**

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Abstract

One obstacle of postgraduate research students is finding and selecting a suitable supervisor to their research areas. A content-based recommender system promises to help these students reducing time and difficulties of the tasks. However, traditional approaches of content-based recommender systems have the over-specification and new user issues. In this project, an ontology-based recommender system suggesting supervisor for postgraduate research students is developed; it makes use the Semantic Web and Linked-Data technologies for overcoming such limitations. This recommender system consists of three main components including Automated Data Curation Tool, Profile Learner, and Recommendation Engine components. The components allow the system to retrieve data from Linked-Data sources and stores them as the background data, input student preferences and match them to the background data to suggest recommendation lists to the students. Along with the components, the Postgraduate Education ontology is also designed to represent all relevant concepts and relationships relating to the decision making process of the system. Besides, a triple store is employed in storing the ontology data in order to make use the reasoning feature as well as improving stability and performance of the system. The recommendation algorithms are designed to exploit semantic characteristics of the Postgraduate Education ontology. The accuracy of the recommendation algorithms is evaluated with a data set mainly coming from Linked Data sources, and the evaluation results shows that it highly satisfies the requirements.

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List of Acronyms / Abbreviations

ACM	Association for Computing Machinery
API	Application Programming Interface
FOAF	Friend of a friend
HTML	HyperText Markup Language
OWL	Web Ontology Language
RDF	Resource Description Framework
RDFS	Resource Description Framework Schema
RS	Recommender system
SKOS	Simple Knowledge Organization System
SPARQL	SPARQL Protocol and RDF Query Language
SW	Semantic Web
URI	Uniform Resource Identifier
XML	eXtensible Markup Language