# A Domain-Specific Knowledge Graph for News Item Recommendations and Information Retrieval

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### Abstract

 $\operatorname{TBD}...$ 

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#### 1 Introduction

Introduction

#### 1.1 Problem

Problem...

#### 1.2 Project Objectives

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#### 1.3 Summary of Findings

Summary of Findings...

#### 1.4 Report Outline

Report Outline...

#### 1.5 Technical Specifications

Technical Specifications...

## 2 Context and Background

#### 2.1 Knowledge Graphs

#### 2.2 Network stuff?

similar to this? https://www.dcs.bbk.ac.uk/r/studentprojects/exampleprojects/msc/" A graph neural network path to network centralities.pdf"

#### 3 Data

What is Reuters data set, how did I get it, etc.

Jupyter notebook – data exploration and preprocessing, diagrams, histograms, etc.

Simple dimensions (properties like subjects, genres, word count) and complex NLP ones (XML body)

Challenges / edge cases: https://github.com/heychrisek/msc-data-science-project/ -  $5 x\mbox{-}challenges$ 

- 3.1 Data Set Collection
- 3.2 Data Input and Preprocessing

### 4 Knowledge Graph Design and Implementation

Continuation of previous section (Data Input and Preprocessing), load into Neo4j...

### 4.1 Graph Database Creation

Neo4j ingest

- 4.2 Semantic Enhancements
- 4.3 Natural Language Processing
- 4.4 Models, etc.???
- 5 Knowledge Graph performance evaluation
- 5.1 Interpretability
- 5.2 Others...confusion matrix, predictions, clustering, betweenness, etc.
- 6 Conclusions
- 6.1 Future Work
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