

Corso di Laurea Magistrale in Ingegneria e Scienze Informatiche

Fancy Title

Tesi di laurea in:
SUPERVISOR'S COURSE NAME

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Sommario

Max 2000 characters, strict.

Optional. Max a few lines.

Indice

Sommario	iii
0.1 Introduzione	1
0.2 Introduzione alla Raccomandazione	1
0.2.1 Tecniche di Raccomandazione	1
0.2.2 Feedback Implicito ed Esplicito	1
0.2.3 Algoritmi di Raccomandazione	1
0.3 Analisi	4
0.3.1 Obiettivi del progetto	4
0.3.2 Requisiti funzionali e non funzionali	4
0.3.3 Analisi del problema	4
0.4 Progettazione	4
0.4.1 Architettura	4
0.4.2 Progettazione modulo preprocessing	4
0.4.3 Progettazione modulo recommendation models	4
0.4.4 Progettazione modulo evaluation	4
0.5 Implementazione	4
0.5.1 Implementazione elementi di preprocessing	4
0.5.2 Interfaccia RecommendationModel	4
0.5.3 Wrapping dei modelli	4
0.5.4 Implementazione metriche	4
0.6 Valutazione	4
0.6.1 Test componenti preprocessing	4
0.6.2 Test con vari tipi di dataset	4
0.6.3 Limiti della soluzione proposta	4
0.7 Conclusioni e Lavori Futuri	4
	5
Bibliografia	5

Elenco delle figure

List of Listings

LIST OF LISTINGS

0.1 Introduzione

0.2 Introduzione alla Raccomandazione

0.2.1 Tecniche di Raccomandazione

Collaborative filtering

Content based filtering

Sistemi Ibridi

0.2.2 Feedback Implicito ed Esplicito

Definizione e differenze tra Feedback Implicito ed Esplicito

Sistemi Ibridi

0.2.3 Algoritmi di Raccomandazione

Notazione

Algoritmi per Feedback Esplicito

Matrix Factorization

KNN

CoClustering

SlopeOne

Evaluation esplicita

Algoritmi per Feedback Implicito

ALS (Alternating Least Squares)

BPR (Bayesian Personalized Ranking)

LMF (Logistic Matrix Factorization)

Evaluation implicita

Algoritmi per la similarità item-item

Algoritmi ibridi

LightFM

Introduzione a modelli di Deep Learning per la Raccomandazione

0.3 Analisi

0.3.1 Obiettivi del progetto

0.3.2 Requisiti funzionali e non funzionali

0.3.3 Analisi del problema

0.4 Progettazione

0.4.1 Architettura

0.4.2 Progettazione modulo preprocessing

0.4.3 Progettazione modulo recommendation models

0.4.4 Progettazione modulo evaluation

0.5 Implementazione

0.5.1 Implementazione elementi di preprocessing

0.5.2 Interfaccia RecommendationModel

0.5.3 Wrapping dei modelli

0.5.4 Implementazione metriche

0.6 Valutazione

0.6.1 Test componenti preprocessing

0.6.2 Test con vari tipi di dataset

0.6.3 Limiti della soluzione proposta

0.7 Conclusioni e Lavori Futuri

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Ringraziamenti

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