# **IMTKU Textual Entailment System for Recognizing Inference in Text at NTCIR-10 RITE-2** Min-Yuh Day<sup>\*</sup>, Chun Tu, Shih-Jhen Huang, Hou Cheng Vong, Sih-Wei Wu

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In this paper, we describe the IMTKU (Information Management at TamKang University) textual entailment system for recognizing inference in text at NTCIR-10 RITE-2 (Recognizing Inference in Text). We proposed a textual entailment system using a hybrid approach that integrate semantic features and machine learning techniques for recognizing inference in text at NTCIR-10 RITE-2 task. We submitted 3 official runs for BC, MC and RITE4QA subtask. In NTCIR-10 RITE-2 task, IMTKU team achieved 0.509 in the CT-MC subtask, 0.663 in the CT-BC subtask; 0.402 in the CS-MC subtask, 0.627 in the CS-BC subtask; In MRR index, 0.257 in the CT-RITE4QA subtask, 0.338 in the CS-RITE4QA subtask. IMTKU is ranked #1 in the CS-RITE4QA subtask of NTCIR-10 RITE-2 task.

## System Architecture



## Methods for Official Runs

• RITE-2-IMTKU-CT-BC Subtask • RITE-2-IMTKU-CT-MC Subtask

## Performance

IMTKU CT BC Subtask	Accuracy	IMTKU CT MC Subtask	Δοουτοογ
Official Runs	Accuracy	Official Runs	Accuracy
RITE2-IMTKU-CT-BC-01	0.663	RITE2-IMTKU-CT-MC-01	0.509
RITE2-IMTKU-CT-BC-02	0.515	RITE2-IMTKU-CT-MC-02	0.366
RITE2-IMTKU-CT-BC-03	0.643	RITE2-IMTKU-CT-MC-03	0.501

IMTKU CS RITE4QA Subtask Official Runs	Top1	MRR	Top5
RITE2-IMTKU-CS-RITE4QA-01	0.1067	0.1991	0.3867
RITE2-IMTKU-CS-RITE4QA-02	0.1467	0.2144	0.3600
RITE2-IMTKU-CS-RITE4QA-03	0.2800	0.3377	0.4267

IMTKU CT RITE4QA Subtask Official Runs	Top1	MRR	Top5
RITE2-IMTKU-CT-RITE4QA-01	0.1467	0.2258	0.3733
RITE2-IMTKU-CT-RITE4QA-02	0.1200	0.1984	0.3267
RITE2-IMTKU-CT-RITE4QA-03	0.1733	0.2603	0.4067



#### RITE-2-IMTKU-CT-BC-01

Tools: CKIP AutoTag, LibSVM

**Resources:** Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL), **Stanford Parser** 

Method: Hybrid approach (Integrated Semantic features and Machine Learning Approach) for NTCIR-10 RITE-2.

Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2.

Multiple Features used (Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity, Tree Edit Distance) in SVM.

#### RITE-2-IMTKU-CT-BC-02

**Tools**: CKIP AutoTag, LibSVM

Resources: Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL), **Stanford Parser** 

Method: Hybrid approach (Integrated Semantic features and Machine Learning Approach) for NTCIR-10 RITE-2.

Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2.

Multiple Features used (Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity) in SVM.

#### RITE-2-IMTKU-CT-BC-03

**Tools**: CKIP AutoTag, LibSVM **Resources**: Stanford Parser

- Method: Machine Learning Approach for NTCIR-10 RITE-2.
- Feature Extraction from normalized t1 and t2.
- Multiple Features used (Longest Common Substring, Word Length Ratio,

#### Text Length, Similarity between t1 and t2, Tree Edit Distance) in SVM.

### RITE-2-IMTKU-CT-MC-01

Tools: CKIP AutoTag, LibSVM

Resources: Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL) ), Stanford Parser

Method: Hybrid approach (Integrated Knowledge Base and Machine Learning Approach) for NTCIR-10 RITE-2..

Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2

Multiple Features used (Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity, Tree Edit Distance) in SVM.

### RITE-2-IMTKU-CT-MC-02

Tools: CKIP AutoTag, LibSVM

**Resources**: Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL) Method: Hybrid approach (Integrated Knowledge Base and Machine Learning Approach) for NTCIR-10 RITE-2.

Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2.

Multiple Features used(Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity) in SVM.

#### RITE-2-IMTKU-CT-MC-03

Tools: CKIP AutoTag, LibSVM **Resources**: Stanford Parser Method: Machine Learning Approach for NTCIR-10 RITE-2. Feature Extraction from normalized t1 and t2. Multiple Features used (Longest Common Substring, Word Length Ratio, Text Length, Similarity between t1 and t2, Tree Edit Distance) in SVM.

## • RITE-2-IMTKU-CT-RITE4QA Subtask • RITE-2-IMTKU-CS-RITE4QA Subtask

#### RITE-2-IMTKU-CT-RITE4QA-01

**Tools**: CKIP AutoTag, LibSVM **Resources**: Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL) RITE-2-IMTKU-CS-RITE4QA-01 **Tools**: CKIP AutoTag, LibSVM

**Resources**: Bilingual Wordnet (SINICA BOW), HIT TongYiCiLing (HIT-TYCL)

## Discussion

- Issues of Definition in RITE MC between NTCIR-9 and NTCIR-10:
  - Definition of NTCIR-9 MC subtask : "A **5-way** labeling subtask to detect (forward / reverse / bidirection) entailment or no entailment (contradiction / independence) in a text pair."
  - Definition of NTCIR-10 MC subtask : "A **4-way** labeling subtask to detect (forward / bidirection) entailment or no entailment (contradiction / independence) in a text pair."
  - Misused NTCIR-9 MC labels on NTCIR-10 MC test datasets where "Reverse" label should be excluded.

### **Cross Validation of Development and Test datasets of NTCIR-10 RITE-2 Task**

Datasets	10 Fold CV Accuracy
RITE2_CT_dev_test_bc_g.txt	68 85%

**Method**: Hybrid approach (Integrated Knowledge Base and Machine Learning Approach) for NTCIR-10 RITE-2. Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2.

Multiple Features used (Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity) in SVM.

#### RITE-2-IMTKU-CT-RITE4QA-02

Tools: CKIP AutoTag, LibSVM Resources: HIT TongYiCiLing (HIT-TYCL) Method: Machine Learning Approach for NTCIR-10 RITE-2. Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2. Multiple Features used (Antonym, Negation, Word Based Siilarity,

#### Token Based Similarity, Lexical overlap, Text Pair Length, Token Length) in SVM.

#### RITE-2-IMTKU-CT-RITE4QA-03

Tools: CKIP AutoTag, LibSVM

#### **Resources**: NONE

**Method**: Machine Learning Approach for NTCIR-9 RITE. Feature Extraction from normalized t1 and t2. Multiple Features used (Longest Common Substring, Text Length, Text Length Ratio, Antonym, Negation) in SVM.

Method: Hybrid approach (Integrated Knowledge Base and Machine Learning Approach) for NTCIR-10 RITE-2. Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2. Multiple Features used (Antonym, Negation, Word Based Similarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length, WorkNet Similarity) in SVM.

#### RITE-2-IMTKU-CS-RITE4QA-02

**Tools**: CKIP AutoTag, LibSVM **Resources:** HIT TongYiCiLing (HIT-TYCL) **Method**: Machine Learning Approach for NTCIR-10 RITE-2. Feature Extraction from normalized t1 and t2. Measure similarity match between t1 and t2. Multiple Features used (Antonym, Negation, Word Based Siilarity, Token Based Similarity, Lexical overlap, Text Pair Length, Token Length) in SVM.

#### RITE-2-IMTKU-CS-RITE4QA-03

**Tools**: CKIP AutoTag, LibSVM Resources: NONE

**Method**: Machine Learning Approach for NTCIR-9 RITE.

Feature Extraction from normalized t1 and t2.

Multiple Features used (Longest Common Substring, Text Length, Text

Length Ratio, Antonym, Negation) in SVM.

(RITE2 BC Dev+Test Dataset: 1321+881 = 2202 pairs)	00.03 /0
RITE1_CT_r1000_dev_test_bc_g.txt	
(Random select 1000 pairs from	73.83%
RITE1 BC Dev+Test Dataset)	
RITE1_CT_dev_test_bc_g.txt	70 200/
(RITE1 BC Dev+Test Dataset: 421+900 =1321 pairs)	12.2970
RITE1_CT_dev_bc_g.txt (gold standard)	70 010/
(RITE1 BC Development Dataset: 421 pairs)	12.2170

## DEMO: http://rite.im.tku.edu.tw

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