

# Restricted Translation Task at WAT'21

Task Organizers

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#### **Consistency: Key to Accurate Translation**

…シフトする帰還回路であり…物体の<u>磁気特性</u>の変化…で検出することができる。

(This is a feedback circuit .... can detect change of magnetic <u>features</u> of an object present ....)



This circuit is a feedback circuit .... can detect changes in the magnetic characteristics-of the object in the center ...
(Online System A's Translation)



This circuit is a feedback circuit .... detect changes in the magnetic properties of objects in the center of ... (Online System B's Translation)

Document-level translation often requires us to have consistent terminology related to technical terms, proper nouns and so on.

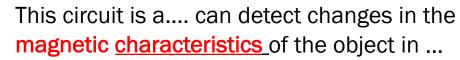
#### **Task Details**

- Redesign ASPEC scientific-domain translation task (Nakazawa et al., 2016)
- "Translate sentences, given a target vocabulary list" (Restricted Vocabulary)
  - Vocab. list containing scientific technical terms in target language
  - NOT accept other terms that are semantically similar to the specified ones

…シフトする帰還回路であり…物体の<mark>磁気特性</mark>の変化…で検出することができる。

["feedback circuit", "magnetic features", ....]

(Restricted Vocabulary List)





This is a feedback circuit .... can detect change of magnetic features of an object present ....



# **Building Restricted Vocabulary**

- Asked 10 bilingual speakers to annotate technical terms/phrases in ASPEC corpus (Nakazawa et al., 2016)
- Created restricted vocabularies for ASPEC's En-Ja/Ja-En MT tasks

.... micromachine .... Zn substitution ....



	En-Ja	Ja-En
Dev	2.8	2.8
Devtest	3.2	3.2
Test	3.3	3.2

Examples of annotated vocabularies in En/Ja

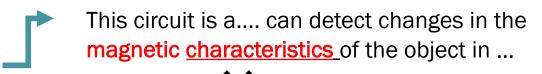
Table 1: Avg # of annotated phrases per sentence

#### **Automatic Evaluation Metric for RT Task**

- Re-rank submitted systems with our designed task-specific metric
  - **BLEU score**, to measure "translation accuracy"
  - Exact match score with restricted vocab, to measure "consistency in translation"

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# **Overview of Submitted Systems**

- In Restricted Translation Task, we received:
  - 3 systems submitted for English-Japanese task
  - 4 systems submitted for Japanese-English task
- Major approaches: Neural MT systems + lexical constraints decoding

Presentation of system description papers regarding RT task:

- 8:10 ~ "NHK's Soft Lexically Constrained Neural Machine Translation at WAT 2021"
- 8:20 ~ "Input Augmentation Improves Constrained Beam Search for Neural Machine Translation: NTT at WAT 2021"
- 8:30 ~ "NICT's Neural Machine Translation Systems for the WAT21 Restricted Translation Task"
- 8:40 ~ "Machine Translation with the Pre-specified Target-side Words Using a Semi-autoregressive Model"

#### Results and Human Evaluation

- Our designed eval. metric is better correlated with human eval scores
- Top-ranked team "NTT" won the best in human evals, too. (even higher than human ref.!)
- Achieving human parity?
  - Detected low-quality human ref data with ratio of (En-Ja, Ja-En) = (13%, 12%)

En-Ja		Human Eval.	
Team	final	src-based DA	src-based CA
NTT	57.2	77.5	79.7
NHK	33.9	74.1	77.2
<b>NICTRB</b>	28.8	73.6	77.1
(human ref.)		73.4	76.4
Ja-En		Human Eval.	
Team	final	src-based DA	src-based CA
NTT	44.1	75.6	74.4
NHK	37.5	73.9	73.5
<b>NICTRB</b>	31.8	72.1	71.8
TMU	22.6	50.2	48.3
(human ref.)	_	74.1	72.9

- Src-based direct assessment (DA) (Cettolo et al, 2017)

### Summary

#### **Restricted Translation task**

- New MT task @WAT'21: "Translate sentences, given a target vocabulary list"
- Built restricted vocabulary from ASPEC for En-Ja/Ja-En tasks
- Design novel task-specific evaluation metric
- Discuss how MT systems can achieve consistent translation

#### **Major Approaches at RT task**

Neural MT systems + lexical constraints

#### **Results and findings at RT task**

- Team "NTT" got won in both tasks, which human eval result also supported