

## Adj-to-V Paraphrasing in Japanese Based on Lexical Constraints of Verbs

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### Approaches to handle paraphrases

- Collecting synonymous expressions
  - from thesauri, parallel/non-parallel corpus, Web, etc.
  - Lexical paraphrases (“burst into tears” ↔ “cry”)
- Describing transfer rules
  - transformational grammar, synchronous grammar, etc.
  - Syntactic paraphrases (passivization, topicalization)
- Combining transfer rules and lexical resources
  - Lexical relation (LFs in MTT: e.g. v(attractive) = attract)
  - Lexical constraints (aspectual property, agentivity, etc.)
  - Compositional paraphrases (alternation, category-shifting)

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### Paraphrases

- “Different expressions that convey the same meaning”
  - The software is available on the Web.
  - You can get the software from the Web.
  - The tool can be downloaded from a Website.

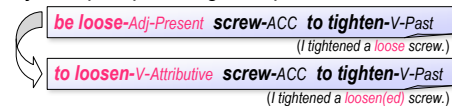
#### Application

- Generation
  - Text simplification [Carroll et al., 1999] [Inui et al., 2003]
  - Pre- and post-editing for MT [Shirai et al., 1995]
- Recognition
  - QA [Hermjakob et al., 2002] [Takahashi, 2005]
  - Multi-document summarization [Barzilay et al., 2003]

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### Phenomena we focus on

#### Adj-to-V paraphrasing in Japanese

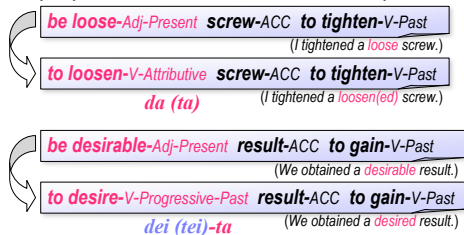


- A challenge to inter-categorical paraphrasing
  - Bridging gaps between different syntactic categories
- Reasonable material for extending lexical semantics
  - Utilizing frameworks for verbs, at first

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### Issue

#### ■ Add proper verbal suffixes to ensure equivalency



- What sorts of suffixes are appended?
- What determines them?

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### Distribution of verbal suffixes

#### ■ Closed example collection $C_{ad-c}$

- 91 Adj tokens
- 148 candidate Vs

- Choice points
  - Voice: *re/φ*
  - Aspect: *tei/φ*
  - Tense: *ru/ta*
- Majority
  - *ta*
  - *re- ru*

Verbal suffixes	# of Adj-V pairs		
	Total	Vi	Vt
<i>ru</i>	9	7	2
<i>tei-ru</i>	5	3	2
<i>re-ru</i>	14	0	14
<i>re-tei-ru</i>	2	0	2
<i>ta</i>	57	44	13
<i>tei-ta</i>	2	0	2
<i>re-ta</i>	6	0	6
<i>re-tei-ta</i>	0	0	0
<i>ta</i> and <i>tei-ru</i>	4	4	0
<i>ta</i> and <i>ru</i>	1	1	0
non-paraphrasable	48	13	35

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## Task

### ■ Determining verbal suffixes

- Input
  - Pair of Adj (source) and V (target) loose ⇔ loosen
  - Head of noun phrase modified by the Adj/V screw
- Output
  - Verbal suffixes for the V da (ta) (Attributive)
    - candidates are those in [Table 1](#)

be loose-Adj-Present screw-ACC to tighten-V-Past  
 (I tightened a loose screw.)  
to loosen-V-Attributive screw-ACC to tighten-V-Past  
 da (ta) (I tightened a loosen(ea) screw.)

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## Method: verbal features

### ■ Verb generation ⇒ Utilizing lexical constraints

- 7 linguistic tests derived from LCS ([Table 2, p.43](#))  
[\[Kageyama, 1996\]](#) [\[Kato et al., 2005\]](#) [\[Takeuchi et al., 2006\]](#)
  - Transitive or intransitive ( $V_a$ )
  - Aspectual property (5 tests:  $V_b$ - $V_f$ )
  - Agentivity (1 test:  $V_g$ )
- Examples of manual examination result
  - nozomu (to desire):  $V_a$ : "yes (transitive)",  $V_b$ : "yes",  $V_c$ : "yes",  $V_d$ : "no",  $V_e$ : "progressive",  $V_f$ : "no",  $V_g$ : "yes"
  - wasureru (to forget):  $V_a$ : "yes (transitive)",  $V_b$ : "no",  $V_c$ : "yes",  $V_d$ : "no",  $V_e$ : "perfective",  $V_f$ : "yes",  $V_g$ : "no"

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## Method: handmade rule-set

### ■ The rule-set consists of 8 rules ([Table 3, p.43](#))

- Each labels either of verbal suffixes ([Table 1](#))
- Conditioned with conjunction of feature-value
  - 7 linguistic test results
  - Some clues are employed in addition
    - N: Semantic class of the noun [\[NIJL, 2004\]](#)
      - e.g. neji (screw): material 1 (1.4151)
    - D: Affix pattern
      - e.g. yurui (be loose) ⇔ yurumu (to loosen): A\_i-V\_mu
    - C: Clause or not
- Otherwise non-paraphrasable

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## Experimental results (Table 4)

Verbal suffixes		$C_{adj-c}$		$C_{adj-o}$	
		Recall	Precision	Recall	Precision
ta	Vi	42/44	42/63	18/18	18/29
	Vt	3/13	3/3	1/6	1/1
re-ru	Vt	12/14	12/19	7/13	7/11
ru	Vi	3/7	3/6	0/1	0/5
	Vt	0/2	0/0	0/1	0/0
tei-ru	Vi	0/3	0/0	0/6	0/0
	Vt	1/2	1/7	2/4	2/5
ta and tei-ru	Vi	2/4	2/2	0/1	0/1
No rule		for 11 inputs		for 6 inputs	
Total (RULE)		63/100 (63%)	63/100 (63%)	29/56 (52%)	29/53 (55%)
BL		57/100 (57%)	57/148 (39%)	24/56 (43%)	24/83 (29%)

### Observations

- Necessary conditions for Vi+"ta" and "re-ru" are covered
- But those rules do not give sufficient conditions
- Others are not well-analyzed yet

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## Conclusion

### ■ What we do:

- Adj-to-V paraphrasing
  - As a case study of inter-categorical paraphrasing
- Determining verbal suffixes in Adj-to-V paraphrasing
  - To ensure equivalence in aspectual meaning
  - Aspectual and agentive properties are useful
    - Majority of the test collection is explained (R, P=.52-.63)
    - (Beats ML and SLM (for our small data-set))
  - (Over-generation & SLM-based filtering work well)

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## Future work

### ■ Further experiments on Adj-to-V paraphrasing

- with a larger dataset
- Explore lexical properties of adjectives and contextual clues
- Re-design the task: features → aspect → suffixes

### ■ Other types of inter-categorical paraphrasing

- Predicative and adverbial usages of adjectives to verbs
- V-to-Adj (reverse)
- Adj-to-N, N-to-Adj, etc.

### ■ Re-formalization as a problem of lexical choice

- In what condition, V is preferable to Adj, Vi is to Vt

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