# The WikEd Error Corpus

Wikipedia and Grammatical Error Correction (GEC)

## Once upon a time...

Taiwanese graduate students often write...

We will discuss about the issue in ...

#### However...

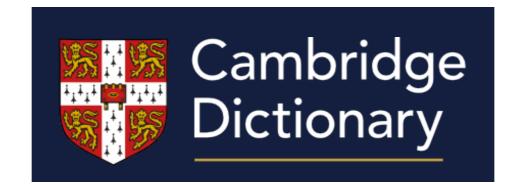
We will discuss about the issue in ...

#### discuss

verb [ T ]

UK

- d) /di'sk∧s/ US
- √dı'sk∧s/

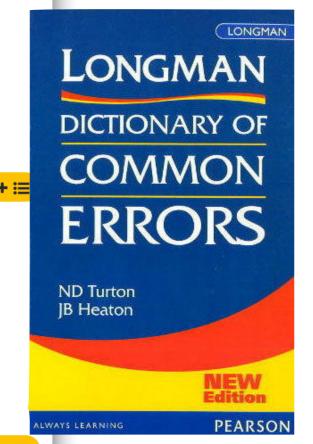




to talk about a subject with someone and tell each other your ideas or opinions

討論,議論,談論

• The police want to discuss these recent racist attacks with local people. 警方希望與當地人討論近期發生的種族主義襲擊事件。



+ ≔

to talk or write about a subject in detail, especially considering different ideas and

#### GEC is ...

We will discuss about the issue in ...

- Correcting errors in a sentence
- How?

Rule-based

Statistical approaches (language model, classifiers)

Machine Translation approaches (state-of-the-art)

## Challenges Faced in GEC

Neural networks models typically require large data to train

Good learner corpora are <u>small</u>

FCE (~30K), NUCLE (~50K)

Large learner corpora are <u>noisy</u> (Lang-8, EFCAMDAT)

discuss about something -> discuss something 162/852 ~= 19%

## Wikipedia

- A free online encyclopedia that anyone can edit
- Very large

Almost 6M articles (~150M sentences)

A lot of revision history!

Including information supplements and error correction

## Revision History

==Rule-based vs. statistical

NLP{{anchorlStatistical\_natural\_language\_processing\_(SNLP)}}

In the early days, many language-processing systems were designed by hand-coding a set of rules, ref name=winograd:shrdlu71>Winograd, Terry (1971). Procedures as a Representation for Data in a Computer Program for Understanding Natural Language. http://hci.stanford.edu/winograd/shrdlu/</ref>ref name=schank77>Roger C. Schank and Robert P. Abelson (1977). Scripts, plans, goals, and understanding: An inquiry into human knowledge structures</re>ref> e.g. by writing grammars or devising heuristic rules for [[stemming]].

However, this is rarely robust to natural language variation.

==Rule-based vs. statistical NLP{{anchorlStatistical natural language processing (SNLP)}}==

In the early days, many language-processing systems were designed by hand-coding a set of rules:cref
name=winograd:shrdlu71>Winograd, Terry (1971). Procedures as a Representation for Data in a Computer Program for Understanding Natural Language. http://hci.stanford.edu/winograd/shrdlu//ref name=schank77>Roger C. Schank and Robert P. Abelson (1977). Scripts, plans, goals, and understanding: An inquiry into human knowledge structures/ref> such as by writing grammars or devising heuristic rules for [[stemming]].

https://en.wikipedia.org/w/index.php?title=Natural language processing&type=revision&diff=919017262&oldid=913095969

## The WikEd Error Corpus

- Grundkiewicz, R., & Junczys-Dowmunt, M. (2014, September). The WikEd error corpus: A corpus of corrective Wikipedia edits and its application to grammatical error correction. In *International Conference on Natural Language Processing* (pp. 478-490). Springer, Cham.
- Code (py2.7) & data

https://github.com/snukky/wikiedits

#### Extract Edits from Wiki

- Iterate over any two adjacent revisions
- To remove vandalism, skip comments containing:
  - "reverting after (...)"
  - "remove vandalism"
  - "undo vandal's edits"
  - "delete stupid joke"

## Get Hands Dirty

https://github.com/dspp779/wikiedits (py3)

\$ pip install https://github.com/dspp779/wikiedits/archive/master.zip

Run with the test file (tests/data/enwiki-20140102.tiny.xml)

\$ wiki\_edits.py <path\_to\_wikixml>

#### **Extracted edits**

- You can use rsync to [-donload-] {+download+} the database.
- There [-is-] {+are+} also [-a-] two computer games based on the movie.
- These anarchists [-argue against-] {+oppose the+} regulation of corporations.
- David Zuckerman is a writer and [-producer-] {+poopface+} for television shows

```
$ cat edit_file | bin/convert_to_wdiff.py
```

## WikEd vs. Lang-8

Statistics	WikEd 0.9	L8-NAIST
# sentences	12.13	2.57
# tokens (source side)	292.57	28.51
# edits	16.01	3.41
# edits per sentence	1.32/sent.	1.33/sent.
% sentences with $\geq$ 1 edit	91.79%	53.86%

## WikEd vs. Lang-8

System	4×2-CV	ST-2013
NUCLE	22.10	27.62
+WikEd	18.21	23.63
+L8-NAIST	24.44	34.06

The WikEd Error Corpus is not an ESL error corpus

#### Filter Edits

- Remove sentences containing:
  - vulgarisms
  - fragments of markup (e.g., <ref>, <br>, [http:])
  - only changes in dates or numerical values
  - non-words tokens over the ratio (>0.5)

### WikEd vs. Lang-8 (with select)

System	4×2-CV	ST-2013
NUCLE	22.10	27.62
+WikEd	18.21	23.63
+Select	<b>24.33</b>	<b>30.06</b>
+L8-NAIST	24.44	34.06
+Select	<b>26.40</b>	<b>34.15</b>

#### **ERRANT**

- Bryant, C., Felice, M., & Briscoe, E. J. (2017, July). Automatic annotation and evaluation of error types for grammatical error correction. Association for Computational Linguistics.
- ERRant ANnotaion Toolkit
- A toolkit that aligns parallel sentences (erroneous and corrected span) and determine error types.

https://github.com/chrisjbryant/errant

#### **Edit Extraction**

Orig only the in the He look night can at only watch TV night Corr He can at

Levenshtein

OrigHeonlycanlookattheTVinthenight.CorrHeØcanØonlywatchTVØatnight.

Damerau-Levenshtein, linguistic features, merging rules

OrigHeonlycanlookattheTVinthenightCorrHecanonlywatchØTVatØnight

#### **Edit Classification**

~50 rule based classification

Original	Corrected	Туре	Rule Info
the	Ø	U:DET	POS
Ø	in	M:PREP	POS
cat	dog	R:NOUN	POS, Lemma
cat	cats	R:NOUN:NUM	POS, Lemma
eats	has eaten	R:VERB:TENSE	POS, Lemma, Parse
atack	attack	R:SPELL	Wordlist

Christopher Bryant, "Automatic annotation and evaluation of error types for grammatical error correction." Talk at ACL 2017.

#### **Edit Classification**

			Operation Tier		
		Туре	Missing	Unnecessary	Replacement
		Adjective	M:ADJ	U:ADJ	R:ADJ
	Of Speech	Adverb	M:ADV	U:ADV	R:ADV
		Conjunction	M:CONJ	U:CONJ	R:CONJ
		Determiner	M:DET	U:DET	R:DET
		Noun	M:NOUN	U:NOUN	R:NOUN
		Particle	M:PART	U:PART	R:PART
er	Part	Preposition	M:PREP	U:PREP	R:PREP
Token Tier	ď	Pronoun	M:PRON	U:PRON	R:PRON
<u>k</u> e		Punctuation	M:PUNCT	U:PUNCT	R:PUNCT
은		Verb	M:VERB	U:VERB	R:VERB
	Other	Contraction	M:CONTR	U:CONTR	R:CONTR
		Morphology	_	_	R:MORPH
		Orthography	_	_	R:ORTH
		Other	M:OTHER	U:OTHER	R:OTHER
		Spelling	_	_	R:SPELL
		Word Order	_	_	R:WO
		Adjective Form	_	_	R:ADJ:FORM
,	ier	Noun Inflection	_	_	R:NOUN:INFL
	_	Noun Number	_	_	R:NOUN:NUM
	<u> </u> 0	Noun Possessive	M:NOUN:POSS	U:NOUN:POSS	R:NOUN:POSS
	Morphology Tier	Verb Form	M:VERB:FORM	U:VERB:FORM	R:VERB:FORM
		Verb Inflection	_	-	R:VERB:INFL
	Š	Verb Agreement	_	_	R:VERB:SVA
		Verb Tense	M:VERB:TENSE	U:VERB:TENSE	R:VERB:TENSE

Christopher Bryant, "Automatic annotation and evaluation of error types for grammatical error correction." Talk at ACL 2017.

## Get Hands Dirty

Run with the test file

\$ python parallel\_to\_m2.py -orig enwiki.tiny.err.tok -cor enwiki.tiny.cor.tok -out enwiki.tiny.tok.m2

 Run with WikEd 1.0 (download from <a href="https://github.com/snukky/wikiedits">https://github.com/snukky/wikiedits</a>)

\$ python parallel\_to\_m2.py -orig wiked.tok.err -cor wiked.tok.cor -out wiked.tok.m2

#### Problem of WikEd 1.0

• Special html symbol remains escaped (affect tokenization)

How to be ' Green'

should be

How to be 'Green'

Need further cleaning and re-tokenization

#### Solution

Unescape the escaped symbols

```
import html
text = html.unescape(text)
```

Re-tokenize (with nltk)

```
from nltk import word_tokenize
text = ' '.join(word_tokenize(text))
```

#### M2 Format

S While some historians trace the roots of European anarchism to movements such as the Free Spirit in the middle ages, there was no cohesive ideology until the nineteenth century.

A 7 7||M:PUNCT|||(|||REQUIRED|||-NONE-|||0

A 8 8||M:PUNCT|||)|||REQUIRED|||-NONE-|||0

S Major advocates of anarchism in that era included Leo Tolstoy, Proudhon, Peter Kropotkin, and Mikhail Bakunin.

A 8 9|||U:NOUN||||||REQUIRED|||-NONE-|||0

A 13 14|||U:NOUN||||||REQUIRED|||-NONE-|||0

A 17 18|||U:NOUN||||||REQUIRED|||-NONE-|||0

### **Annotation Format**

- We propose a new format, Diff+.
- M2 used in NUCLE, ERRANT
- GNU wdiff<sup>1</sup> used in the WikEd corpus and "git diff --word-diff"
- Diff+ Extend wdiff to include error type annotation

<sup>1</sup>https://www.gnu.org/software/wdiff/

#### Diff+

- All spaces in edits are substituted by full-width spaces (\u3000)
- Compactly connect delete and insert elements of replace errors

We can [-discuss-] {+talk+} about it.

Attach (<u>error type</u>) at the end of the edit token

https://github.com/NTHU-NLPLAB/gec-preprocess

## The benefits using Diff+

- Easy to iterate over tokens (simply text.split(' '))
- Error types are explicitly indicated

```
We can [-discuss-]{+talk+}(R:VERB) about it.
```

Replace edits is implicitly indicated

```
We can [-discuss-] {+talk+} about it . (wdiff)
```

Still easy to read by human

## Summary

- Introduce the WikEd error corpus and a ERRor ANnotation Toolkit
- Further clean existing corpora and propose a new way of filtering data
- A new error annotation format (Diff+)

https://github.com/snukky/wikiedits https://github.com/chrisjbryant/errant

https://github.com/NTHU-NLPLAB/gec-preprocess

jjc@nlplab.cc