

### iTELL: An Update

Intelligent Technological Enhanced Language Learning

by

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# Introduction / Recap

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### Introduction



- ▶ PhD Candidate at NTU, Singapore
- Roughly 1 year to finish
- ▼ Topic: "Using Rich Models of Language in Grammatical Error Detection" (English, Mandarin Chinese)
  - using the ERG as the base for an app helping engineering students' academic writing
  - develop Zhong to a point where it can help beginner learners of Mandarin Chinese

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### Mal-Rules



#### Definition (Schneider and McCoy, 1998):

- Applicable to computational grammars (e.g. HPSG)
- ▶ Hand-written rules that extend grammars
- Increase coverage of the grammar
- ♣ Allow the parsing of ungrammatical sentences

#### Uses:

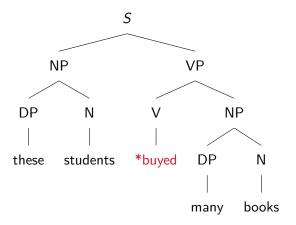
- Identify specific language errors
- Able to reconstruct multiple possible meanings
- Used for student feedback

Introduction / Recap 4/28

# Mal-Rule (Inflectional Rule)



\* These students buyed many books.

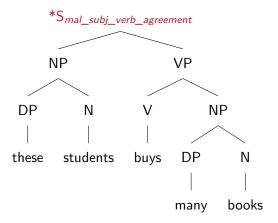


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# Mal-Rule (SVA)



\* These students buys many books.

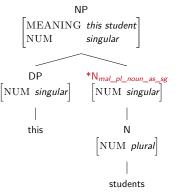


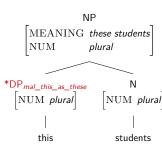
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# **Multiple Corrections**



Reconstructing multiple possible intended meanings

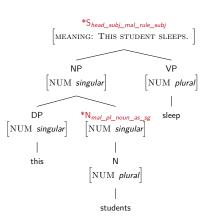


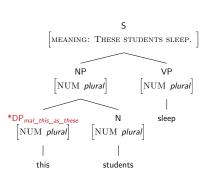


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# Multiple Reconstructions







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# ERG & Automated Student Writing Support

### **NTUCLE**



- ▶ NTU Corpus of Learner English (NTUCLE)
- ▶ 180 human tagged documents
  - course assignments
  - ▶  $\sim$ 9.50k sents,  $\sim$ 120k words
- New tagging schema
  - based on other schemas (e.g. NUS, Cambridge)
  - ▶ 53 error tags divided in 15 categories
- ♣ 6 annotators, course lecturers
- ~800 documents 'automatically annotated' (growing every semester)

### LCC Sentence Feedback



#### This is what you wrote:

66 This systems corrects language problem 55

#### This is what we think might be wrong with it:

#### AGREEMENT (plural noun): corrects

- This sentence may have a verb that expects subject which is a singular noun (just one item of something which can be counted, e.g. 'device'), but
  its subject does not agree with the verb.
- Please check the sentence, and change the verb so it agrees with its subject (e.g. 'The devices cost ...') OR make the subject a singular noun (e.g. 'The device costs ...').

#### ARTICLE (missing): language problem

- This sentence has a singular noun (one item of something which can be counted, e.g. 'device') without an article ('a', 'an', 'the'), determiner (e.g. 'each', 'this') or possessive (e.g. 'her', 'its') before it.
- Please check your sentence carefully, and add an article, determiner or possessive before the singular noun (e.g. 'the device') OR change the subject to a plural noun (more than one item, e.g. 'devices').

#### DETERMINER ('this' vs. 'these'): this

- You may have used the determiner 'this' instead of 'these' before a plural countable noun (more than one item of something that can be counted
  and has a plural form, e.g. devices') in your sentence.
- Please check your sentence for the use of 'this' before a plural noun, and change it to 'these' OR change the plural noun to a singular noun (e.g. 'that device').

### LCC Document Feedback



#### Anti Food Deserta

#### Background:

In the recent years, Singapore's food wastage rate shoots rapidly hall domains of food production and consumption, wastage of food has grown significantly. Article by food waste republic shows that in 2011, each Singaporean can generate 130kg of food waste per year, out of 0.68 million tons of food waste being thrown each year, only 10% could be recycled; [1].

Prob — This sentence is much longer than the average sentence. It may be difficult for readers to read the sentence and understand it after reading it once. There is also a higher risk of making grammar mistakes in such a long sentence. You may want to consider breaking up the this sentence to make it easier for the reader to follow the text.

It would be fine greene—You may used a word or phrase that our lecturers would like you to avoid tons of. Please double check if it is necessary, and rephrase it you do do not not provide the control of the provided that it is necessary, and rephrase it.

Thus Afficience in meaning and waste in text in is been used as the title.

#### Solution:

To control the growth of this issue, i prospec to setup a convenient way to distribute the wasted edible food. It requires combined effort from organizations, such as Disabled People's Association (DPA), flighting for the welfare of the elderly, disabled and the poor. Of them, they are facing problem of flood shortage, lineted of wasting food by discarding them, a more reasonable way would be distributing them to these needy group. These organizations can set up centers all amount Singapore to ease the collection of excess food on the other hand, an app will be created for the convenience of norlinging these centers for food collection. This provides a direct interaction between the food owners and the centers, cushing the food wasted from cosmetic filtering as now there is a better way for producers for make use of them Att such it would reduce the amount of eddle food wasted diple and instead, put into good use to all the needy. This can be beneficial especially within short term, while lowering the food wastage, it also provided the buffer time for other possible longer term solution to take effect.

#### Benefits:

The immediate benefited ones would be the needy groups, directly solving their food shortage. This also cuts burden on NEA's pilot project reported in Channel News Asia [3], in the effort to reduce inedible food wastage.

#### Implementation:



#### **Automated Student Writing Support**



- Collab. with Language and Communication Centre, NTU
- **▶** Large cohorts (2000+ engineering students)
- Pedagogical challenges: correction, feedback, timing
- ▶ 80+ error types (ERG + iTELL + NLP)

#### Goals:

- Error Detection + Feedback
- Explore and evaluate possible solutions
- Decide on best corrections on their own

### **Results and Future Directions**



- Learning experiment involving 1600 students (paired assignment) showed promising results
  - Double blind review
  - ▶ Positive impact 84% of the time
- Current focus: improving feedback messages
- Slightly expand ERG's error coverage (e.g. prepositional selection)

# **Zhong & iXue**

Zhong & iXue 15/28

#### **NTU Learner Corpus of Mandarin Chinese**



- ≥ 21 error-types based on lecturers' experience
- ▶ Data was collected from past-exams ( $\approx$  5,600 sentences)
  - ▶ Annotated for error types ( $\approx$  1,600 errors)
  - ▶ 1360 sentences (24.3%) contain at least one error
  - ightharpoonup pprox 1.2 errors per (problematic) sentence.
- Tagged by two native Mandarin speakers
- Data is not open (i.e. research only)

Zhong & iXue

# **Extending Zhong**



- Document type hierarchy
- Constrain spurious ambiguity

   (e.g. question-phrases, attachment of negation)
- Constrain some flexibility (Determiners without CLs, AP without degree modifiers, etc.)
- Added romanization (pinyin) input
- Increase lexical and syntactic coverage

Separable verbs (e.g. 生病, 生了病), reduplication, vocab acquisition

Zhong & iXue 17/28

# **Extending Zhong (II)**



#### Regression Data:

- Tokyo University of Foreign Studies
- Mandarin Textbook Data
- Zhong's MRS test suite

#### Regression Results:

- ▶ ≈ 2.5k Sentences Regression
- **▶** 58.36% → 74.55 %
- $\Rightarrow$   $\approx$  5% structural,  $\approx\!\!10\%$  lexical/tokenization lexicon acquisition is incomplete

Zhong & iXue 18/28

# Where is Structure lacking?



- Classifiers and Numeric Phrase predication practically non-existent
- Comparatives practically non-existent
- Better treatment of passives
- ▶ 把 Imperatives
- Argument Changing Complements duration, state, result, potential
- Prepositional Complements currently a single token with the verb

Zhong & iXue 19/28

#### **Mandarin Common Error Classes**



- **★** Other Other errors requiring correction
- ★ 吗 redundancy (V 不 V, 几, etc.)
- ★ Adjectival predicate sentence
  Syntactic position of adverbial clause
  中国 vs 中文
- ★ Usage of 和 vs. 也
- ★ 有点儿 vs. 一点儿 mix-up
- ★ Syntactic position of 也 (e.g. before the subject, after the verb) Emphasizing sentence 是... 的... Adjectival predicate sentence with 不
- **★** Adjectival predicate sentence without adverbials
- ★ Adjective modifier without degree adverbials

Missing Measure word after Π Incorrect measure word

Incorrect measure word

Usage of 二 vs. 两

Syntactic order of multiple adverbials 不, 都, 也, etc.

Usage of 不 vs. 没有

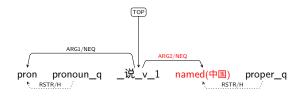
Numerical phrase predicate sentence

Zhong & iXue 20/28

### **Semantic Errors**



#### 我说中国。



- Some problems are not strictly syntactic
- mal-rules are not the best way to deal with them
- we can use semantic analysis to flag problems like these

♪ 中国 is not a prototypical argument of 说

Zhong & iXue 21/28

# **DELPH-IN Grammarium**

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### **Grammarium**



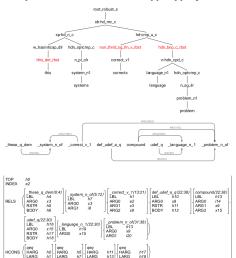
- ▶ Web-based toolkit for grammar development
- DELPH-IN Viz libraries
- Grammar Update/Compile (from SVN/GitHub)
- Inspect Profiles
- Basic Regression Testing Support

DELPH-IN Grammarium 23/28

# **Quick Demo**



#### "This systems corrects language problem"



DELPH-IN Grammarium 24/28

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  - Joint research funded by Fuji Xerox Corporation on Multilingual Semantic Analysis

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### References



Lee, I. (2004). Error correction in L2 secondary writing classrooms: The case of Hong Kong. Journal of Second Language Writing, 13(4):285–312.

Morgado da Costa et al. (2020). Automated Writing Support Using Deep Linguistic Parsers (in print). Proceedings of the 12th Conference on Language Resources and Evaluation. European Language Resources Association (ELRA). Marseille, France.

Morgado da Costa et al. (2016). Syntactic Well-Formedness Diagnosis and Error-Based Coaching in Computer Assisted Language Learning using Machine Translation. Proceedings of the 3rd Workshop on Natural Language Processing Techniques for Educational Applications (NLPTEA2016). Osaka, Japan.

Morgado da Costa, Luis and Sio, Joanna Ut-Seong (2020). *CALLIG: Computer Assisted Language Learning using Improvisation Games (in print)*. Proceedings of the Games and Natural Language Processing Workshop at the 12th Edition of the Language Resources and Evaluation Conference. European Language Resources Association (ELRA). Marseille, France.

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### References



Nagata, N. (1996). Computer vs. workbook instruction in second language acquisition. CALICO Journal, 14(1):53–75.

Schneider, D. and McCoy, K. F. (1998). Recognizing syntactic errors in the writing of second language learners. In Proceedings of the 17th International Conference on Computational Linguistics - Volume 2, COLING '98, pages 1198–1204, Stroudsburg, PA, USA. Association for Computational Linguistics.

Suppes, P., Liang, T., Macken, E. E., and Flickinger, D. P. (2014). Positive technological and negative pre-test-score effects in a four-year assessment of low socioeconomic status k-8 student learning in computer-based math and language arts courses. Computers & Education, 71:23–32.

Winder et al. (2017). NTUCLE: Developing a corpus of learner English to provide writing support for engineering students. Proceedings of the 4th Workshop on NLP Techniques for Educational Applications (NLPTEA 2017). Taipei, Taiwan.

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# Thank you!

Thank you! 28/28