# Projeto Final 06 avanços 1a. semana

NSGC - Neural Spell & Grammar Checker (en/pt)

Rafael Ito 28/05/2020

# Plano da Apresentação

- Planejamento/Cronograma original
- O que foi realizado na semana
- O que será feito na próxima
- Planejamento/Cronograma atualizado

# Planejamento/Cronograma original

### Semana 1: 21/maio → 27/maio

## (estudos iniciais)

- o Estudos direcionados.
- Leitura dos artigos envolvidos.
- Familiarização com datasets.
- o Primeira proposta de projeto em detalhes.

## Semana 2: 28/maio → 03/junho

## (experimentações)

- Teste de modelos com diferentes números de parâmetros (base, large, etc).
- Comparação em termos de qualidade e custo computacional de corretores baseados em BERT e T5.
- Uso de diferentes métricas para calcular palavras/sentenças mais próximas da que está em análise ( edit distance , SBERT).

# O que foi realizado na semana

- Leitura de artigos
- Familiarização com datasets
- Códigos:
  - métricas de avaliação
  - o primeiro modelo

## **HOO: Helping Our Own**

HOO is an ongoing shared task concerned with the automated correction of errors in text.

#### HOO-2011:

- all error types
- almost all participating teams dealt with **article and preposition** errors only (besides spelling and punctuation errors)

#### HOO-2012:

Article and preposition

2010 - [HOO] Helping Our Own: Text Massaging for Computational Linguistics as a New Shared Task (Dale & Kilgarriff, 2010)

2011 - [HOO-2011] Helping Our Own: The HOO 2011 Pilot Shared Task (Dale & Kilgarriff, 2011)

2012 - [HOO-2012] HOO 2012: A Report on the Preposition and Determiner Error Correction Shared Task (Dale et al., 2012)

		Previo	Previous shared tasks		
		2019	Cross-Framework Meaning Representation Parsing	English	
CoNLL		2018	Universal Morphological Reinflection	multilingual	
The SIGNLL Conference on Computational Natural Language Learning		2018	Multilingual Parsing from Raw Text to Universal Dependencies	multilingual	
		2017	Multilingual Parsing from Raw Text to Universal Dependencies	multilingual	
	2017	Universal Morphological Reinflection	multilingual		
Tasks:		2016	Multilingual Shallow Discourse Parsing	English, Chinese	
	NED (named entity recognition)	2015	Shallow Discourse Parsing	English	
		2014	Grammatical Error Correction	English	
•	SRL (semantic role labeling)	2013	Grammatical Error Correction	English	
•		2012	Modelling Multilingual Unrestricted Coreference in OntoNotes	English, Chinese, Arabic	
•	coreference resolution	2011	Modelling Unrestricted Coreference in OntoNotes	English	
•	etc	2010	Hedge Detection	English	
		2009	Syntactic and Semantic Dependencies in Multiple Languages	multilingual	
		2008	Joint Parsing of Syntactic and Semantic Dependencies	English	
		2007	Dependency Parsing: Multilingual & Domain Adaptation	multilingual	
		2006	Multi-Lingual Dependency Parsing	multilingual	
		2005	Semantic Role Labeling	English	
		2004	Semantic Role Labeling	English	
		2003	Language-Independent Named Entity Recognition	English, German	
		2002	Language-Independent Named Entity Recognition	Spanish, Dutch	
		2001	Clause Identification	English	
		2000	Chunking	English	
		1999	NP Bracketing	English	

#### **CoNLL-2013**

**Task:** GEC (Grammatical Error Correction)

Correct only 5 error types:

- Article or determiner
- Preposition
- Noun number
- Verb form
- Subject-verb agreement

#### **Evaluation metric:**

- F<sub>1</sub> score
- MaxMatch (M²) score: score minimal edits

1	human	annotator

Error tag	Error type	Example sentence	Correction (edit)
ArtOrDet	Article or determiner	In <i>late</i> nineteenth century, there	late → the late
		was a severe air crash happening	
		at Miami international airport.	
Prep	Preposition	Also tracking people is very	$in \rightarrow for$
		dangerous if it has been con-	
		trolled by bad men in a not good	
		purpose.	
Nn	Noun number	I think such powerful device	device → devices
		shall not be made easily avail-	
		able.	
Vform	Verb form	However, it is an achievement as	$progressed \rightarrow progressing$
		it is an indication that our soci-	
		ety is progressed well and peo-	
		ple are living in better condi-	
		tions.	
SVA	Subject-verb agreement	People still prefers to bear the	prefers → prefer
		risk and allow their pets to have	
		maximum freedom.	

2013 - [CoNLL-2013] The CoNLL-2013 Shared Task on Grammatical Error Correction (Ng et al., 2013)

#### **CoNLL-2014**

**Task:** GEC (Grammatical Error Correction)

Correct 28 error types

**NUCLE corpus** (the NUS Corpus of Learner English)

Collection of 1,414 essays written by students that have English as a 2nd language at the National University of Singapore (NUS).

#### **Evaluation metric:**

• F<sub>0.5</sub> score: emphasizes precision over recall

2 human annotators (independently)

SGML format (Standard Generalized Markup Language)

Type	Description	Example		
Vt	Verb tense	Medical technology during that time [is → was] not advanced enough to		
		cure him.		
Vm	Verb modal	Although the problem [would $\rightarrow$ may] not be serious, people [would $\rightarrow$		
		might] still be afraid.		
V0	Missing verb	However, there are also a great number of people [who → who are] against		
		this technology.		
Vform	Verb form	A study in 2010 [shown → showed] that patients recover faster when sur-		
		rounded by family members.		
SVA	Subject-verb agreement	The benefits of disclosing genetic risk information [outweighs → out-		
		weigh] the costs.		
ArtOrDet	Article or determiner	It is obvious to see that [internet → the internet] saves people time and also		
		connects people globally.		
Nn	Noun number	A carrier may consider not having any [child → children] after getting		
N.		married.		
Npos	Noun possessive	Someone should tell the [carriers → carrier's] relatives about the genetic		
DC	D	problem.		
Pform	Pronoun form	A couple should run a few tests to see if [ <b>their</b> $\rightarrow$ they] have any genetic		
Pref	Pronoun reference	diseases beforehand.  It is everyone's duty to ensure that [ <b>he or she</b> → they] undergo regular		
riei	Pronoun reference	health checks.		
Prep	Preposition	This essay will [discuss about → discuss] whether a carrier should tell his		
Пер	Freposition	relatives or not.		
Wci	Wrong collocation/idiom	Early examination is [healthy → advisable] and will cast away unwanted		
*****	wrong conocation/idiom	doubts.		
Wa	Acronyms	After [WOWII → World War II], the population of China decreased		
,,,,	reconjuna	rapidly.		
Wform	Word form	The sense of [guilty $\rightarrow$ guilt] can be more than expected.		
Wtone	Tone (formal/informal)	[It's $\rightarrow$ It is] our family and relatives that bring us up.		
Srun	Run-on sentences,	The issue is highly [debatable, a → debatable. A] genetic risk could come		
	comma splices	from either side of the family.		
Smod	Dangling modifiers	[Undeniable, → It is undeniable that] it becomes addictive when we spend		
		more time socializing virtually.		
Spar	Parallelism	We must pay attention to this information and [assisting → assist] those		
		who are at risk.		
Sfrag	Sentence fragment	However, from the ethical point of view.		
Ssub	Subordinate clause	This is an issue [ <b>needs</b> $\rightarrow$ that needs] to be addressed.		
WOinc	Incorrect word order	[Someone having what kind of disease → What kind of disease someone		
		has] is a matter of their own privacy.		
WOadv	Incorrect adjective/	In conclusion, [ <b>personally I</b> $\rightarrow$ I personally] feel that it is important to tell		
m	adverb order	one's family members.		
Trans	Linking words/phrases	It is sometimes hard to find [out $\rightarrow$ out if] one has this disease.		
Mec	Spelling, punctuation,	This knowledge [maybe relavant $\rightarrow$ may be relevant] to them.		
D1	capitalization, etc.	To be seen to the forest and a seen about a seed and to the seed of the seed o		
Rloc-	Redundancy	It is up to the [patient's own choice → patient] to disclose information.		
Cit	Citation	Poor citation practice.		
Others	Other errors	An error that does not fit into any other category but can still be corrected.		
Um	Unclear meaning	Genetic disease has a close relationship with the <b>born gene.</b> (i.e., no cor-		
		rection possible without further clarification.)		

2014 - [CoNLL-2014] The CoNLL-2014 Shared Task on Grammatical Error Correction (Ng et al., 2014)

#### JFLEG dataset and GLEU metric

**Original:** they just creat impression such well that people are drag to buy it .

**Minimal edit:** They just create an impression so well that people are dragged to buy it.

Fluency edit: They just create such a good impression that people are compelled to buy it.

#### **GUG corpus** (Grammatical/Ungrammatical)

- 3.1k sentences written by English language learners for the TOEFL exam
- **GUG score:** (1–4, where 4 is perfect or native sounding, and 1 incomprehensible)
- **Evaluation metric:** GLEU (Generalized Language Understanding Evaluation)

#### GLEU:

- based on BLEU
- score fluency in addition to minimal edits
- penalize n-grams that should have been changed in the system output but were left unchanged

2015 - [GLEU] Ground Truth for Grammatical Error Correction Metrics (Napoles et al., 2015)

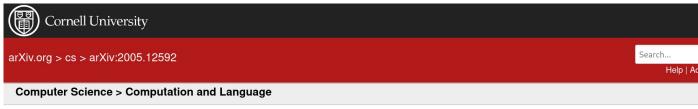
2016 - [GLEU] GLEU Without Tuning (Napoles et al., 2016)

2017 - [JFLEG] JFLEG: A Fluency Corpus and Benchmark for Grammatical Error (Napoles et al., 2017)

## **Other datasets**

- CoNLL-2013
- CoNLL-2014
- JFLEG
- FCE
- ICNALE
- KJ
- BEA: grammatical, lexical and orthographical errors

#### Late paper



[Submitted on 26 May 2020]

#### **GECTOR -- Grammatical Error Correction: Tag, Not Rewrite**

Kostiantyn Omelianchuk, Vitaliy Atrasevych, Artem Chernodub, Oleksandr Skurzhanskyi

In this paper, we present a simple and efficient GEC sequence tagger using a Transformer encoder. Our system is pre-trained on synthetic data and then fine-tuned in two stages: first on errorful corpora, and second on a combination of errorful and error-free parallel corpora. We design custom token-level transformations to map input tokens to target corrections. Our best single-model/ensemble GEC tagger achieves an  $F_{0.5}$  of 65.3/66.5 on CoNLL-2014 (test) and  $F_{0.5}$  of 72.4/73.6 on BEA-2019 (test). Its inference speed is up to 10 times as fast as a Transformer-based seq2seq GEC system. The code and trained models are publicly available.

Comments: Accepted for publication in BEA workshop (15th Workshop on Innovative Use of NLP for Building Educational Applications; co-located with ACL)

Subjects: Computation and Language (cs.CL); Machine Learning (cs.LG)

Cite as: arXiv:2005.12592 [cs.CL]

(or arXiv:2005.12592v1 [cs.CL] for this version)

### Late paper

Neural Machine Translation (NMT)-based → pre-trained Transformer-NMT-based sequence generation → sequence tagging

#### **Evaluation:**

- CoNLL-2014
- BEA

Encoder	CoNLL-2014 (test)			BEA-2019 (dev)		
Lincodei	P	R	$\mathbf{F_{0.5}}$	P	R	$\mathbf{F_{0.5}}$
LSTM	51.6	15.3	35.0	-	-	_
ALBERT	59.5	31.0	50.3	43.8	22.3	36.7
BERT	65.6	36.9	56.8	48.3	29.0	42.6
GPT-2	61.0	6.3	22.2	44.5	5.0	17.2
RoBERTa	67.5	38.3	58.6	50.3	30.5	44.5
XLNet	64.6	42.6	58.5	47.1	34.2	43.8

Table 6: Varying encoders from pretrained Transformers in our sequence labeling system. Training was done on data from training stage II only.

### **Code**

https://colab.research.google.com/drive/194LQ5UyrmFJOKUPL7qyAcDFkcfWF3qV1?authuser=1#scrollTo=gTGvw969QXqO

# O que será feito na próxima semana

- Experimentações
  - BERT (base / large)
  - T5 (small, base, large, 3b, <del>11b</del>)
- Tabela com resultados
  - Qualidade
  - Custo computacional
- Proposta de arquitetura final (RoBERTa?)

# Planejamento/Cronograma atualizado

#### Semana 2: 28/maio → 03/junho

- Leitura do último artigo (GECToR).
- Teste de modelos com diferentes números de parâmetros (base, large, etc).
- Comparação em termos de qualidade e custo computacional de corretores baseados em BERT e T5.
- Uso de diferentes métricas para calcular palavras/sentenças mais próximas da que está em análise (edit distance, SBERT).
- Proposta da arquitetura final.
- Compilação dos diferentes testes produzidos na semana anterior.

### Semana 3: 04/junho → 10/junho

(entrega do corretor em inglês)

- Compilação dos diferentes testes produzidos na semana anterior.
- · Proposta da arquitetura final.
- o Decidir o modelo a ser usado
- Começar o corretor em inglês
- Finalização do corretor para inglês.