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Anglicized Words and Misspelled Cognates in Native Language Identification

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Abstract

- **Native Language Identification (NLI)**: the task of identifying the native language (L1) of a person based on his/her writing in the second language (L2).
- **Language transfer effect**: L1 influences learners' second language writing.
- **Direct application**: second language teaching.

1. Phenomena

Three of the phenomena responsible for the incorrect expansion of L2's vocabulary using L1 material:

- **Cognates**: words that have the same ancestors or were derived from the same sources, e.g., SPA. *religión* and ENG. *religion*.
Misspelled cognates: words that are misspellings from the point of view of L2, but have a very close form in L2 and L1.
- **L2-ed (anglicized) words**: words in L1 that were "adjusted" to seem and sound like legitimate L2 words: *lentaly* instead of *slowly* (SPA. *lentamente*).
- **Spelling errors** capture language-specific sound-to-spelling mappings.

2. Data and Experiment Setup

The subsets of the TOEFL11 and ICLEv2 datasets that cover languages that use the Latin script.

- **TOEFL4**: French, German, Italian, Spanish; 1,100 essays per language
- **ICLE4**: French (347 essays), German (437), Italian (392), Spanish (251)
- Tokenization
- Term frequency (*tf*) weighting scheme
- Liblinear Support Vector Machines (SVM)
- 10-fold cross-validation

3. Features

- **Part-of-speech (POS) features** capture the morpho-syntactic patterns in a text: Penn Treebank tagset (36 tags).
- **Function words (FWs)** clarify the relationships between the content-carrying elements of a sentence and introduce syntactic structures: 318 FWs from the scikit-learn package.
- **Misspelled cognates**
 1. For each misspelled English word w_m identify the intended word w_e using a spell-checking tool.
 2. For each L1:
 - a) Look up the translation w_f of the intended word w_e in L1.
 - b) Replace diacritics in w_f with the corresponding Latin equivalent (e.g., "é" → "e").
 - c) Compute the Levenshtein distance D between w_e and w_f .
 - d) If $D(w_e, w_f) < 3$ then w_f is assumed to be a cognate of w_e .
 - e) If w_f is a cognate and $D(w_m, w_f) < D(w_e, w_f)$ then consider the L1 as a clue of the native language of the author.
- **L2-ed words**
 1. For each misspelled English word w_m identify its closest word in some L1:
 2. For w_f in each L1:
 - a) Replace diacritics in w_f with the corresponding Latin equivalent.
 - b) Compute the Levenshtein distance $D(w_m, w_f)$.
 - c) Identify the L1 with the smallest $D(w_m, w_f)$ value, and if $D(w_m, w_f) < 5$ then take w_m to be an L2-ed version of w_f and consider w_m as a clue for the native language of the author.

- **Spelling errors (SE)**: misspelled words are represented through character n-grams ($n = 1-3$) and added as a separate subset of the feature vector.

Table 1. Examples: POS & FW & cognates & L2-ed words features.

have a happy *ancianity*

ancianity (ENG. old age) → SPA. *ancianidad* → L2-ed

→ **have a JJ SPA-L2-ed**

a good *inocent* man

inocent (ENG. innocent) → SPA. *inocente* → cognate

→ **a JJ SPA-cognate NN**

N-grams ($n = 1-3$) from this representations are extracted.

4. Results

- **Results on the TOEFL4 and ICLE4 datasets**

Table 2. Accuracy (%) on the TOEFL4 and ICLE4 datasets.

Features	TOEFL4			ICLE4		
	Acc. %	Diff	No.	Acc. %	Diff	No.
Majority baseline	25.00			30.62		
Cognates	37.34	12.34*	4	38.55	7.93*	4
L2-ed	36.05	11.05*	4	44.85	14.23*	4
Cognates & L2-ed	39.84	14.84*	8	46.18	15.56*	8
Cognates & L2-ed & SE	54.55	29.55*	7,347	56.33	25.71*	6,391
POS & FW 1-3 grams	74.45		231,737	80.58		189,622
POS & FW 1-3 grams & cognates	75.50	1.05*	236,716	80.72	0.14	192,572
POS & FW 1-3 grams & L2-ed	75.80	1.35*	247,814	81.56	0.98	198,469
POS & FW 1-3 grams & cognates & L2-ed	76.20	1.75*	253,175	81.77	1.19	201,623
POS & FW 1-3 grams & SE	78.23	3.78*	238,929	82.75	2.17*	195,869
POS & FW 1-3 grams & cognates & L2-ed & SE	78.80	4.35*	260,367	82.61	2.03*	207,870

- **Proficiency-level experiments**

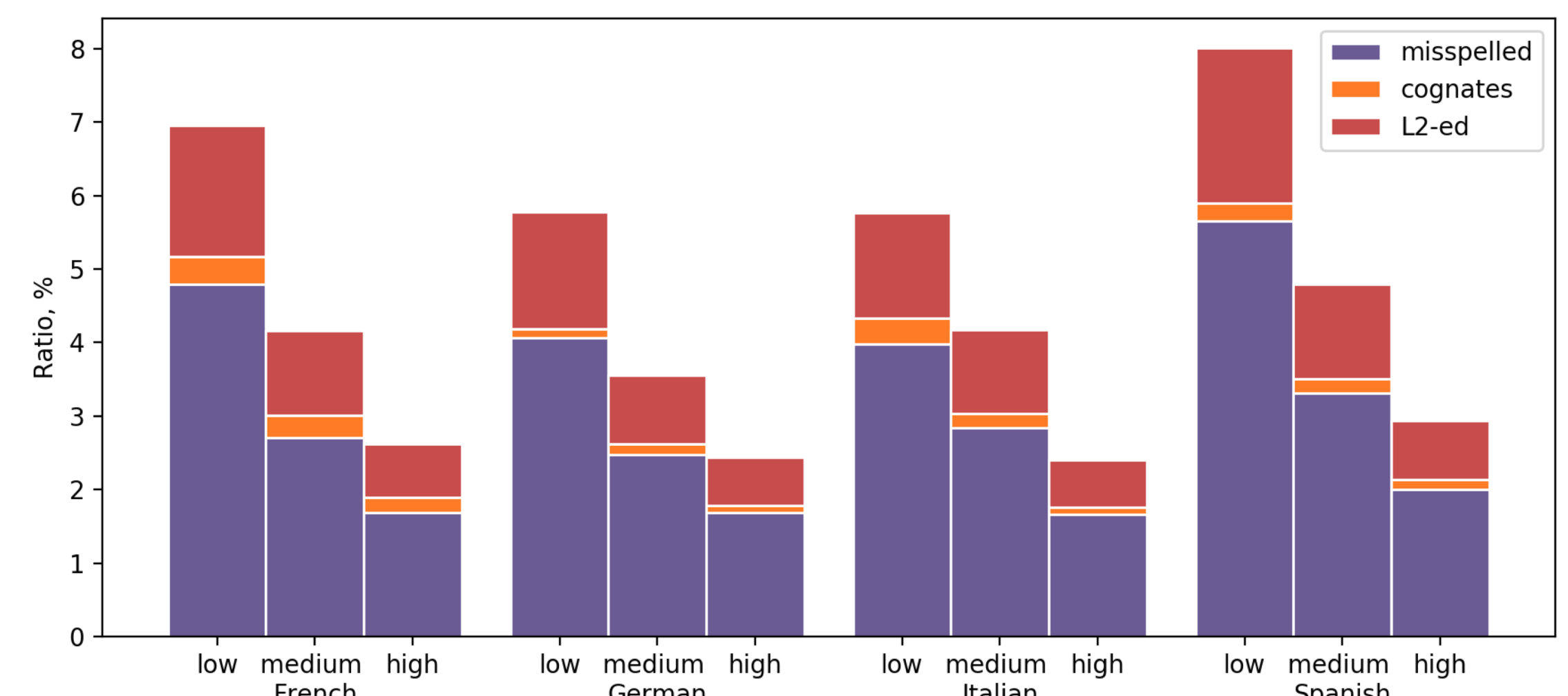


Figure 1. Ratio (%) of the misspelled words, cognates, and L2-ed words to the total number of words for each language within each proficiency level.

Table 3. Accuracy (%) for each proficiency level.

Features	Low			Medium			High		
	Acc. %	Diff	No.	Acc. %	Diff	No.	Acc. %	Diff	No.
Majority baseline	51.09			28.64			35.35		
Cognates	56.49	5.40*	4	39.81	11.17*	4	40.23	4.88*	4
L2-ed	58.12	7.03*	4	38.39	9.75*	4	36.24	0.89	4
Cognates & L2-ed	59.24	8.15*	8	42.57	13.93*	8	40.18	4.83*	8
Cognates & L2-ed & SE	60.79	9.70*	3,241	55.26	26.62*	6,031	45.95	10.60*	5,366
POS & FW 1-3 grams	62.92		34,970	74.33		148,878	67.71		152,105
POS & FW 1-3 grams & cognates	62.38	-0.54	35,609	75.57	1.24*	152,158	68.08	0.37	154,318
POS & FW 1-3 grams & L2-ed	65.16	2.24	37,214	76.17	1.84*	159,508	68.03	0.32	160,025
POS & FW 1-3 grams & cognates & L2-ed	64.54	1.62	37,922	77.09	2.76*	163,057	68.55	0.84	162,419
POS & FW 1-3 grams & SE	66.09	3.17	38,114	78.14	3.81*	154,774	70.07	2.36*	157,346
POS & FW 1-3 grams & cognates & L2-ed & SE	69.13	6.21*	41,066	79.25	4.92*	168,953	71.28	3.57*	167,660

5. Conclusions

- All three phenomena provide useful information for identifying the L1 of the author.
- Higher results are achieved when features representing each of these are combined: they are complementary for the NLI task.
- The frequency of misspellings in general – and of L2-ed words – decreases with an increase in proficiency, but their contribution to the NLI task remains strong for all levels.