

Automatic Detection of Linguistic Indicators As a Means of Early Prediction of Alzheimer's and of Related Dementias: A Cross Linguistic Analysis

Vassiliki Rentoumi*, PhD¹, George Paliouras, PhD¹, Konstantinos Bougiatiotis, MSc¹, Dimitra Arfani², Katerina Fragkopoulou², Spyridoula Varlokosta PhD² and Peter Garrard, PhD, FRCP³

¹NCSR 'Demokritos', Athens, Greece, ²National and Kapodistrian University of Athens (UoA), ATHENS, Greece, ³St George's, University of London, United Kingdom, *vassiliki.rentoumi@gmail.com

Background

- Alzheimer's Disease (AD) and other types of dementia are associated with changes in spoken language
- Language Evaluation is time consuming and in most cases subjective

Aims of the study

- To adopt a computational approach based on machine learning (ML) to analyze language samples from native speakers of English and Greek in order to automatically detect early indicators of AD
- To identify **AD-induced language characteristics** that are either **cross-linguistic** or **language-specific**

Materials and Methods

Speech samples were taken from **three sources**: Two from archived (English) language resources and one (Greek) collected for this project. Participants were shown the "cookie theft" picture¹ and were asked to describe what they could see happening.

Analytical Approach

Feature Extraction: Bag of Words assumption (BoW), Part of Speech (PoS) tags, Lexical Variation (LV) and Syntactic Complexity (SC) measures

Feature Selection: (1) Common top ranked Information Gain (IG) words across the three data sets; **(2) Commonly distinctive** PoS, LV, SC between AD & NC groups (p-value < 0.05) across data sets

Classification of spoken samples

Data sets Class: Samples (Avg. MMSE)	DEMENTIA (US) ²	OPTIMA (UK) ³	GREEK
	AD: 309 (19.0)	AD: 180 (21.1)	AD: 17 (20.0)
	NC: 246 (27.5)	NC: 248 (27.0)	NC: 14 (28.6)

Cross Linguistic Analysis Results

(1) Correlations/overlap of common top-100 ranked (IG) words

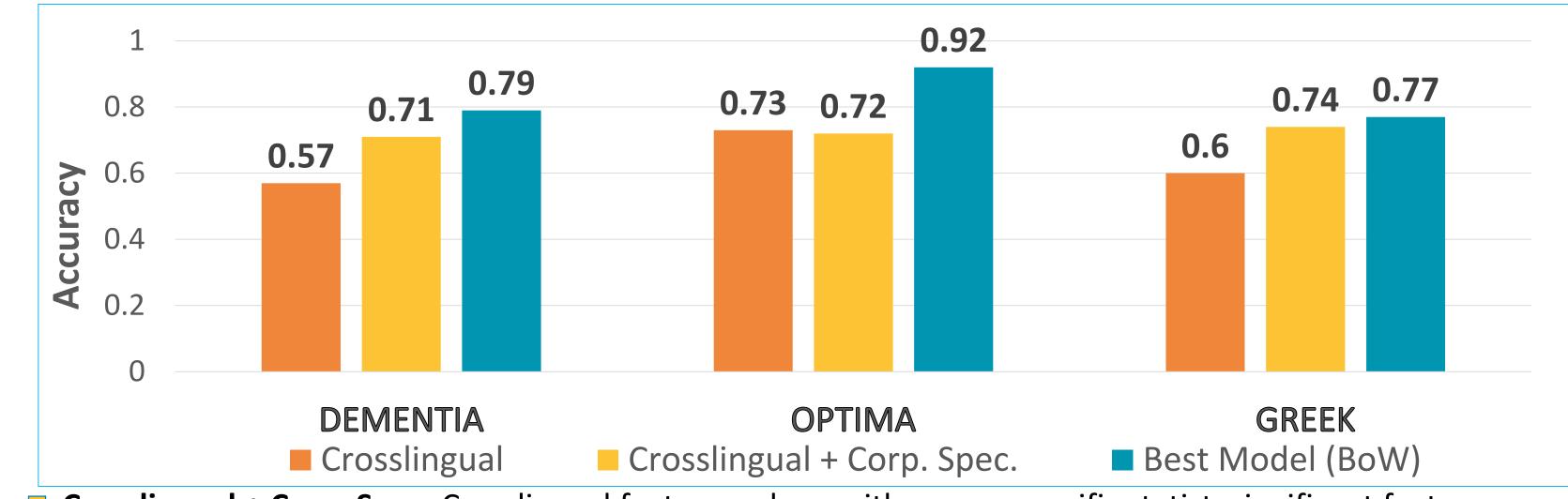
	DEMENTIA- GREEK	DEMENTIA- OPTIMA	OPTIMA- GREEK
Pearson's Correlation	0.3	0.79	0.52
Spearman's Rank Correlation	0.26	0.62	0.39
% Common words in top-100	0.49	0.36	0.41

(2) Commonly distinctive (t-Test, p<0.05) PoS, LV, SC features between AD & NC groups across data sets

Crosslingual (i.e. all samples)	US English & Greek
*CCW (AD >NC)	Adverb Freq. (AD>NC)
**CWR (AD>NC)	Nouns/Tokens (NC>AD)
Nouns Freq. (AD>NC)	Pronouns/Nouns (AD>NC)
	Mean Length Sentence (NC>AD)

^{*}Closed Class Words Count (conjunctions, determiners, prepositions, pronouns)

Classification Results



■ Crosslingual + Corp. Spec: Crosslingual features, along with corpus specific statist. significant features

■ Best Model (BoW): Tf-idf scores of lemmatized unigrams and bigrams

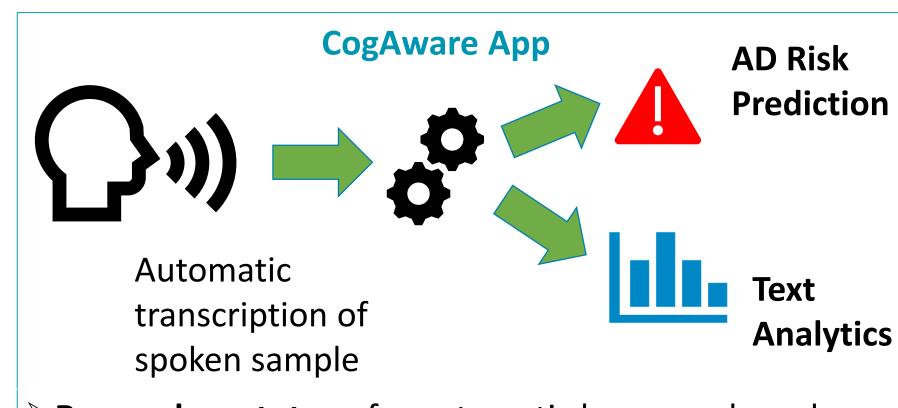
Conclusions

- ✓ **Discriminative** power of LV, SC and PoS features **verified across languages**
- ✓ State-of-the art accuracy of deployed system
- ✓ Development of CogAware prototype

Future Work

- Fusion of crosslingual features with best model (complementarity of errors)
- Preliminary findings indicate enhanced performance

Additional Work



- ➤ Research prototype for automatic language-based assessment of AD risk factor
- ➤ Android application and Google Drive Add-on
- ➤ Quick and accurate screening of patients for AD
- ➤ Pilot deployed in day-care centers (GR)











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References

¹Goodglass, Harold. Boston diagnostic aphasia examination: Short form record booklet. Lippincott Williams & Wilkins, 2000.

²Becker, J. T., Boller, F., Lopez, O. L., Saxton, J., & McGonigle, K. L. (1994). The natural history of Alzheimer's disease: description of study cohort and accuracy of diagnosis. *Archives of Neurology*, 51(6), 585-594.

³https://www.ndcn.ox.ac.uk/research/centre-prevention-stroke-dementia/resources/optima-oxford-project-to-investigate-memory-and-ageing













^{**}Closed Class/Open Class Words Ratio (Open Class: nouns, adjectives, verbs, adverbs)