

# Towards Automatic Multilingual Readability Assessment

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THESIS PROPOSAL – APRIL 2016 – BOISE STATE UNIVERSITY

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# Motivation

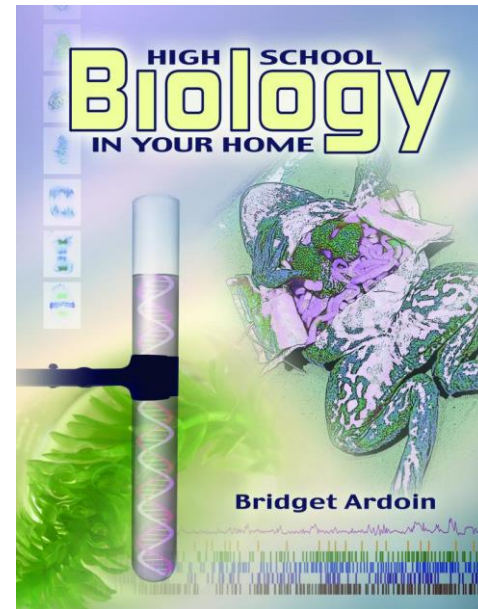
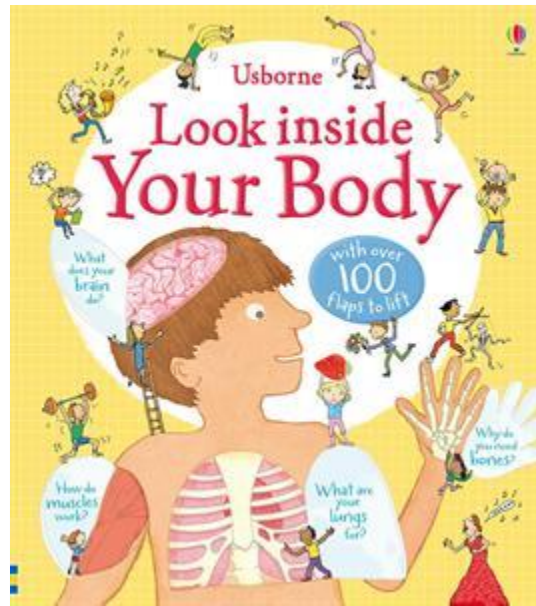
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Reading for learning versus reading for understanding



# What is Readability?

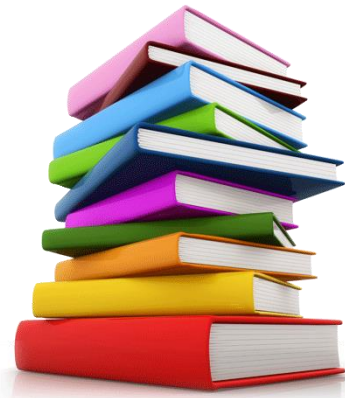


Text complexity/Readability

# Applications of Readability



# Text simplification for people with reading difficulties



# Book recommendation



## Literacy assessment



## Ensuring medical and legal document understanding

## Related Work: Languages



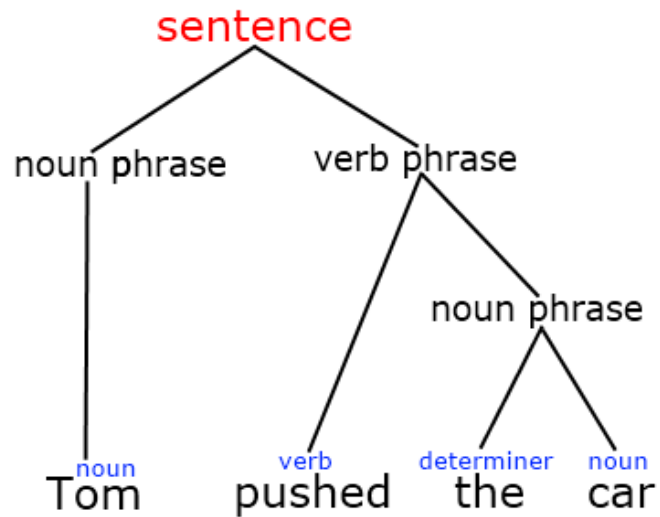


# Related Work: Features

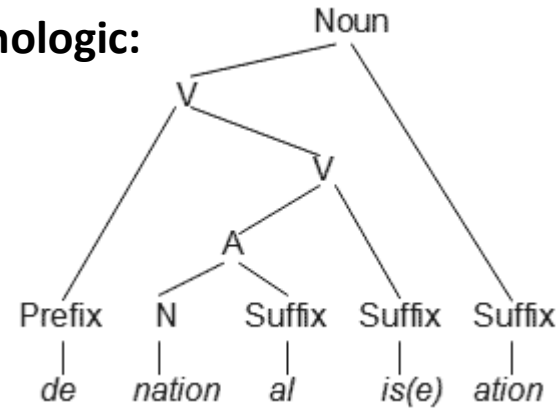
Traditional:

shal·low

Syntactic:



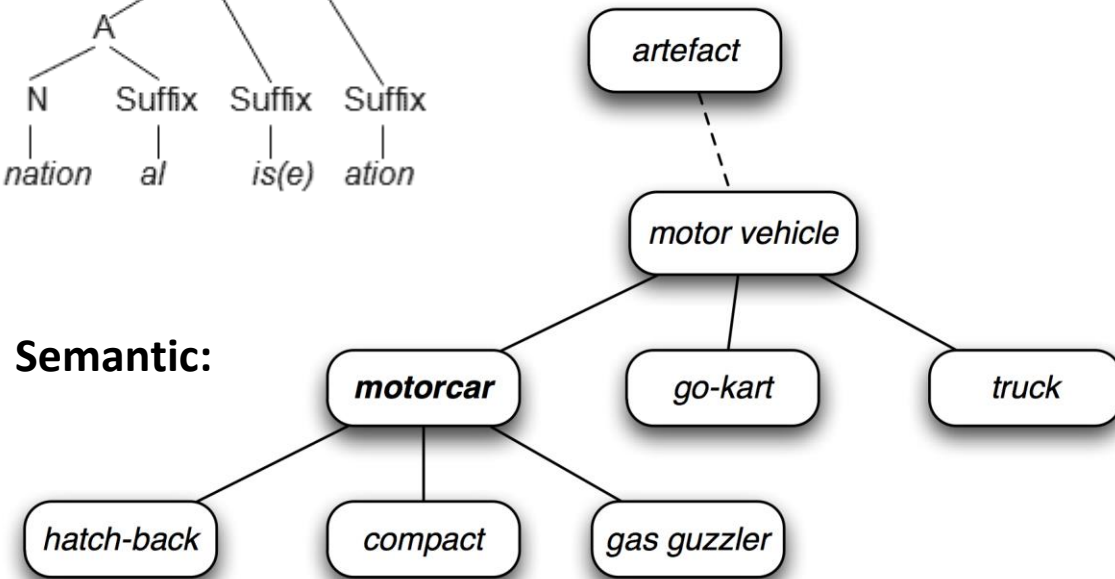
Morphologic:



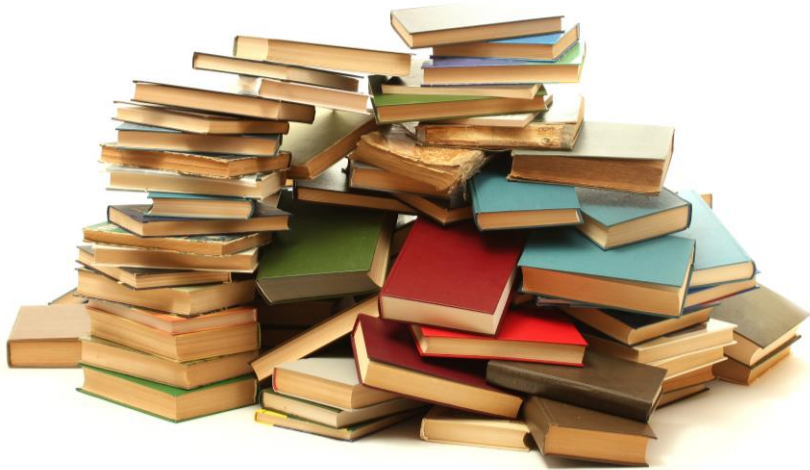
Metadata:

<category/>

Semantic:



# Related Work: Document Types



**K**aži mi koji sat nosiš i reći ću ti tko si. Ova već pomalo potrošena fraza primjenjiva na naše brojne navike i vrijednosti koje posjedujemo zapravo je nevjerovatno istinita. Gotovo je nemoguće da na ruci nosite sat poput Glashuette Originala, a da ne znate da iza njega stoji višestoljetna urarska tradicija ili pak da uz najnovije Boss odijelo na ruku stavite novi Swatch popularnoga dizajners, a da trenutačno ne budete prepoznati kao trendsetter. Ma kakav bio sat koji nosite on govori prije svega o tome koliko o satovima znate, kakav vam je ukus, a u konačnici i koliko si možete priuštiti. Uz prilog koji vam je u rukama odabir sata koji želite bit će vjerujem lakši. Posjetili smo dva vodeća sajma koji prate novosti iz svijeta satova, a donosimo i priču o velikome povratku mehaničkoga sata. Ljubitelji automobila iznenadit će se čitajući prilog *Sat za svaki automobil* koliko su ova dva svijeta posljednjili



**Lucy is going to  
the park and  
she is taking the  
dog for a walk.**



# Thesis Statement

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- Multilingual Readability Assessment System (MRAS)

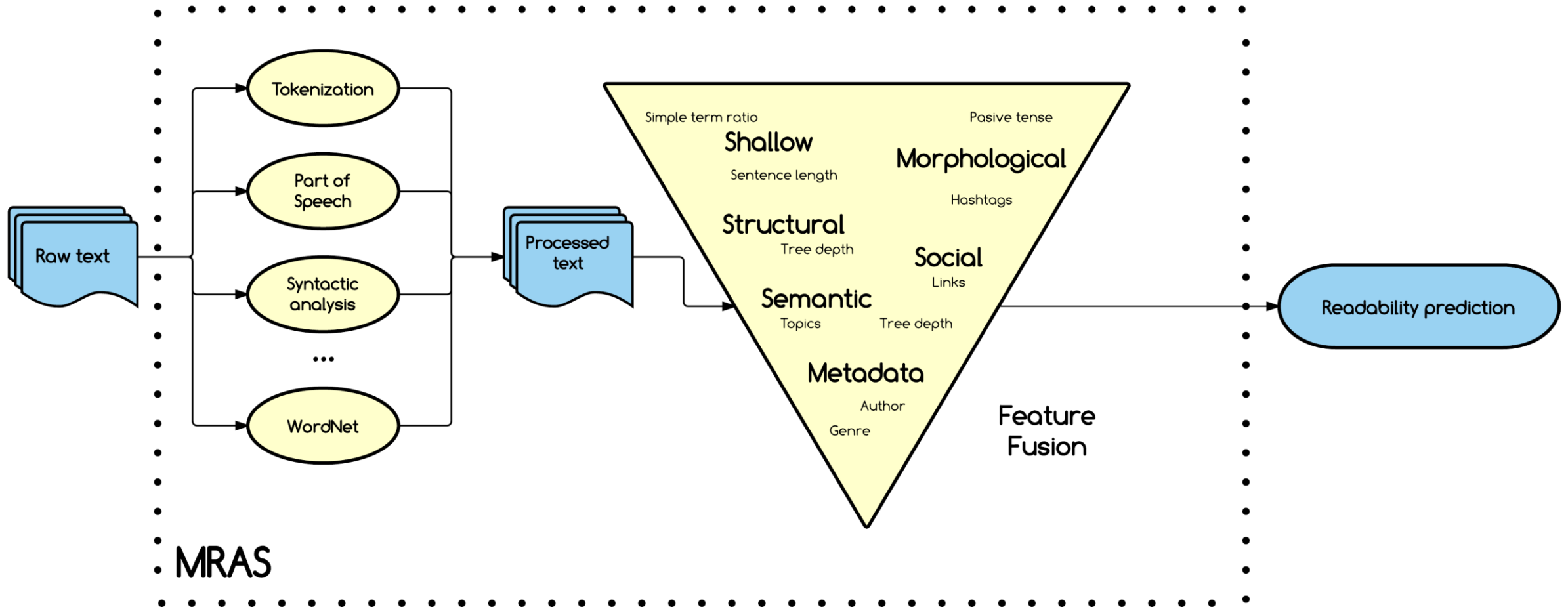
- Multilingual
- Multi-document
- Open-source
- Adaptable

- How:

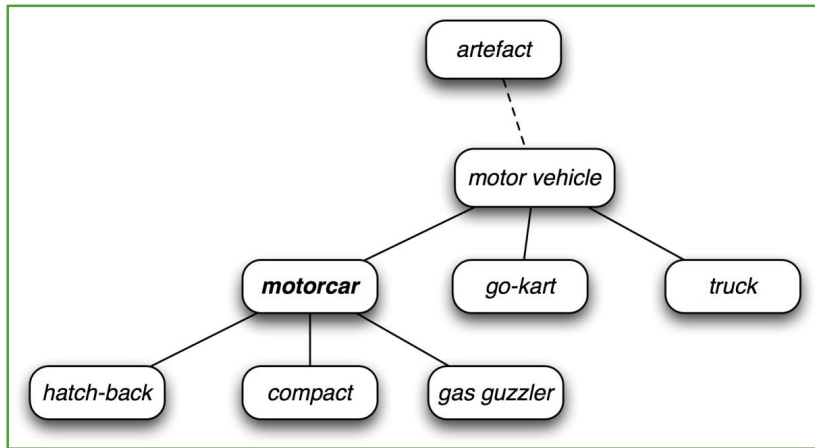
- Analysis of existing features
- Exploration and design of new features
- Analysis of fusion methods



# Proposed Method



# Text Processing



WordNet

- Tokenization
- Sentence Split
- Part of Speech
- Dependency
- Named entities

Freeling

Terms	Documents													
	M1	M2	M3	M4	M5	M6	M7	M8	M9	M10	M11	M12	M13	M14
abnormalities	0	0	0	0	0	0	0	1	0	1	0	0	0	0
age	1	0	0	0	0	0	0	0	0	0	0	1	0	0
behavior	0	0	0	0	1	1	0	0	0	0	0	0	0	0
blood	0	0	0	0	0	0	0	1	0	0	1	0	0	0
close	0	0	0	0	0	0	1	0	0	0	1	0	0	0
culture	1	1	0	0	0	0	0	1	1	0	0	0	0	0
depressed	1	0	1	1	1	0	0	0	0	0	0	0	0	0
discharge	1	1	0	0	0	1	0	0	0	0	0	0	0	0
disease	0	0	0	0	0	0	0	0	1	0	1	0	0	0
fast	0	0	0	0	0	0	0	0	0	1	0	1	1	1
generation	0	0	0	0	0	0	0	0	1	0	0	0	1	0
oestrogen	0	0	1	1	0	0	0	0	0	0	0	0	0	0
patients	1	1	0	1	0	0	0	1	0	0	0	0	0	0
pressure	0	0	0	0	0	0	0	0	0	0	1	0	0	1
rats	0	0	0	0	0	0	0	0	0	0	0	0	1	1
respect	0	0	0	0	0	0	0	1	0	0	0	1	0	0
rise	0	0	0	1	0	0	0	0	0	0	0	0	0	1
study	1	0	1	0	0	0	0	0	1	0	0	0	0	0

LSA

# Feature Extraction

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Shallow features	Morphological	Structural	Semantic	Social*	Metadata
<ul style="list-style-type: none"><li>• Word length</li><li>• Sentence length</li></ul>	<ul style="list-style-type: none"><li>• Tense</li><li>• Number</li></ul>	<ul style="list-style-type: none"><li>• Syntactic</li><li>• Pragmatic</li><li>• Dependency ngrams *</li></ul>	<ul style="list-style-type: none"><li>• Concept density</li><li>• Followability*</li><li>• Ambiguity*</li></ul>	<ul style="list-style-type: none"><li>• Hashtags</li><li>• Links</li><li>• Mentions</li></ul>	<ul style="list-style-type: none"><li>• Author</li><li>• Description</li><li>• Genre</li></ul>

\*Novel

# Feature Fusion

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Classification



Regression



Ordinal Classification

# Evaluation

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## ❑ Dataset

Language	Dataset	Description
English	Lexile	Contains book titles associated with readability level
	Standardized tests	Tests for English level, contain various texts per test
	Other	News for kids, exercises for learning English
Spanish	Lexile	Contains book titles associated with readability level
	Learning resources	Various exercises for learning Spanish
Basque	Learning resources	Various exercises for learning Basque
Multilingual	Parallel corpus	Same documents translated into English and Spanish

## ❑ Metrics: Accuracy, Precision, Recall, RMSE...



# Research Questions

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- ❑ Performance: Learning model, Feature subset
- ❑ Features versus Language
- ❑ Comparison : Baselines, State of the art
- ❑ Same text in different language, same readability level?
- ❑ Can a MRAS be trained for two languages and predict a third one?
- ❑ Languages with low resources, can get help of other languages's data?

# Schedule

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Date	Milestone
April 2016	Gather existing datasets for design and development
May 2016	Feature Exploration
June 2016	Feature fusion
July 2016	Experiments
July 2016	Thesis draft
August 2016	Defense

# Questions?

