# TOWARDS A METRIC FOR PARAPHRASTIC MODIFICATION

ABSTRACT AVAILABLE AT: HTTPS:

//dh2018.adho.org/en/towards-a-metric-for-paraphrastic-modification/

### Maria Moritz,<sup>1</sup> Johannes Hellrich,<sup>2,3</sup> and Sven Büchel<sup>3</sup>

<sup>1</sup> eTRAP Research Group, University of Goettingen, Germany
<sup>2</sup>Graduate School "The Romantic Model", Friedrich-Schiller-Universität Jena, Germany
<sup>3</sup>JULIE Lab, Friedrich-Schiller-Universität Jena, Germany

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Text Reuse is the written repetition of text. In historical texts, text reuse detection challenges include:

language variation over time

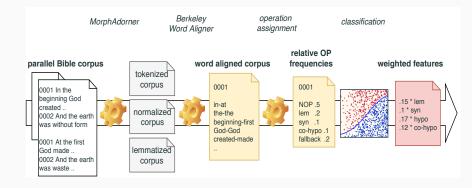
incomplete witnesses

diverse reuse types

To further improve automatic detection of paraphrase, we:

quantify paraphrastic modification to better understand reuse







Name	Abbr.	Publication	Source	Translation Class
The Webster Bible	WBT	1833	bst <sup>1</sup>	standard
English Revised Version	ERV	1881-1894	mys <sup>2</sup>	standard
Darby Bible	DBY	1890	ptp <sup>3</sup>	standard
Brenton's English Septuagint	LXXE	1844-1884	mys <sup>2</sup>	literal
Young's Literal Translation	YLT	1862	bst <sup>1</sup>	literal
Smith's Literal Translation	SLT	1876	mys <sup>2</sup>	literal

<sup>3</sup> Mayer & Cysouw 2014



<sup>1</sup> http://www.biblestudytools.com/

<sup>2</sup>www.mysword.info/

#### They that wait renew their strength they mount up with wings as eagles they walk [...] be weary

							/	/	
fallback	syn	syn	NOP	hyper	NOP	lower	/hypo	lem	syn

Those expecting pass to power They raise up the pinion as eagles They go [...] are fatigued



They that wait rene		Abbr.	Operation		walk [] be weary			
\ \		int i circ	NOP	perfect match	1	/	.]	
			lower	case-folding matches		/	/	
	fallback		lem	lemmatizing matches		/		
	fallback syn	syn	editdist	writing variant	er /	hypo	lem	syn
			syn	synonyms match				
			hyper	source word is hypernym of target word				
			hypo	source word is hyponym of target word	//			
т	hose exp	pecting	co-hypo	co-hyponyms match	۶ſ.	.] are	fatig	Jed
			fallback	other	["	., are		



Darby's Bible Translation & the English Revised Version

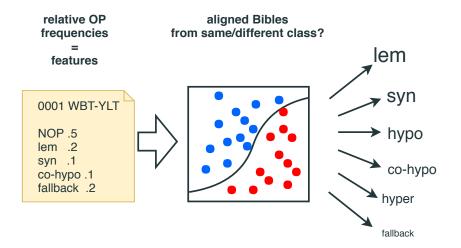
id	NOP	lower	lem	editdist	syn	hyper	hypo	co-hypo	fallback
01001001	0.889	0.0	0.111	0.0	0.0	0.0	0.0	0.0	0.0
01001002	0.815	0.037	0.0	0.0	0.037	0.0	0.0	0.0	0.111
01001003	0.9	0.1	0.0	0.0	0.0	0.0	0.0	0.0	0.0

Young's & Smith's Literal Translation

id	NOP	lower	lem	editdist	syn	hyper	hypo	co-hypo	fallback
01001001	0.778	0.0	0.111	0.0	0.0	0.0	0.0	0.111	0.0
01001002	0.72	0.04	0.0	0.0	0.04	0.04	0.0	0.0	0.16
01001003	0.714	0.0	0.143	0.0	0.0	0.0	0.0	0.0	0.143



# LOGISTIC REGRESSION MODELING (YES/NO-DECISION)





Label(x <sub>i</sub> )	Operation	Estimated coefficient $ heta_{ m relative}$
NOP	perfect match	dropped
lower	case-folding matches	0.060
lem	lemmatizing matches	0.195
low_editdist	writing variant	0.068
syn	synonyms match	0.190
hyper	source word is hypernym of target word	0.117
hypo	source word is hyponym of target word	0.170
co-hypo	co-hyponyms match	0.122
fallback	other	0.078
		= 1.000



Label(x <sub>i</sub> )	Operation	Estimated
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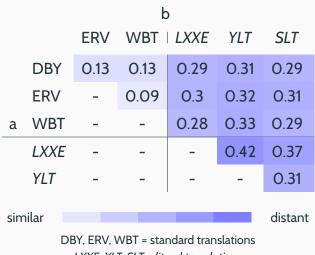


Based on the estimated coefficients, and the operation frequencies, we define the paraphrasticality par between two word-aligned text spans a and b as:

$$par(a,b) = \sum_{i=0}^{n} \theta_i x_i^{a,b}$$



## VALIDATION OF PAR(A,B)



LXXE, YLT, SLT = literal translations



### We present a technique to measure paraphrasticality that:

- describes paraphrasticality as frequency of modifications for which we find empirical weights, and
- is specifically useful for applications in the humanities as operation frequencies and weights are open to manual inspection.
- Future Work: a comprehensive comparison against existing metrics (e.g., BLEU, METEOR) will be published (Moritz et al. 2018, LaTeCH).



# THANK YOU!



### Presentation

### Maria Moritz

 Image: Several several

### **Co-authors**

Johannes Hellrich

🕅 http://modellromantik.uni-jena.de

johannes.hellrich@uni-jena.de

#### Sven Büchel

http://julielab.de

🖄 sven.buechel@uni-jena.de







Deutsche Forschungsgemeinschaft



**APPENDIX** 

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