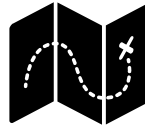




# **INDIVIDUALITY IN SYNTACTIC VARIATION**

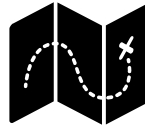
## **AN INVESTIGATION OF THE 17TH-CENTURY GERUND ALTERNATION**

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Leiden University Centre for Linguistics (LUCL)  
University of Manchester

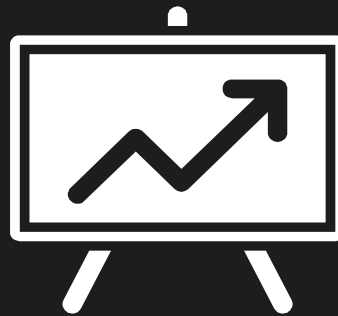


### **Why is the individual important to consider?**

- (1)** Increasing evidence that individuals are quite different in L1-attainment (Dabrowska 2012), and differences in individual usage exist to the extent that they can be used to identify speakers (Barlow 2013, Nini 2018).
- (2)** If a population is very heterogeneous, not considering individual behavior makes you run the risk of:
  - Missing patterns (Gries & Hilpert 2010; Tagliamonte & Baayen 2012)
  - mistakenly identifying patterns (Fonteyn 2017)



- Growing body of historical (socio-)linguistic studies on **syntactic change** devote more attention to:
  - **Agents of change and diffusion** (e.g., Pratt & Denison 2000 [but: Van Bergen 2013]; Bergs 2005; Raumolin-Brunberg 2009)
  - **How individual behavior feeds into population-level change** (e.g., Nevalainen *et al.* 2011; Nevalainen & Raumolin-Brunberg 2016; Baxter & Croft 2016; Hundt *et al.* 2017; Petré 2017; Petré & Van de Velde 2018).



## **THE GERUND ALTERNATION**



## HISTORICAL DEVELOPMENT

**VARIANT OF:** ... should affect us more  
then *the shedding **of** the warmest blood in  
our veins* (John Flavell, 1668 > EMMA)

vs.

**VARIANT Ø:** ... made an end of ø  
*Shedding ø the Blood of Rams* (George  
Fox, 1686 > EMMA)

## HISTORICAL DEVELOPMENT



### Old English

Gerund is an abstract deverbal noun in -ing, with nominal syntactic features (NG) (e.g. *by shedding **of** blood*)



### Middle English

Gerund was re-analysed as part of the verb system and acquired the ability to govern a *direct object* (Fanego 2004)  
(c. 1250 - e.g. *by shedding blood*)

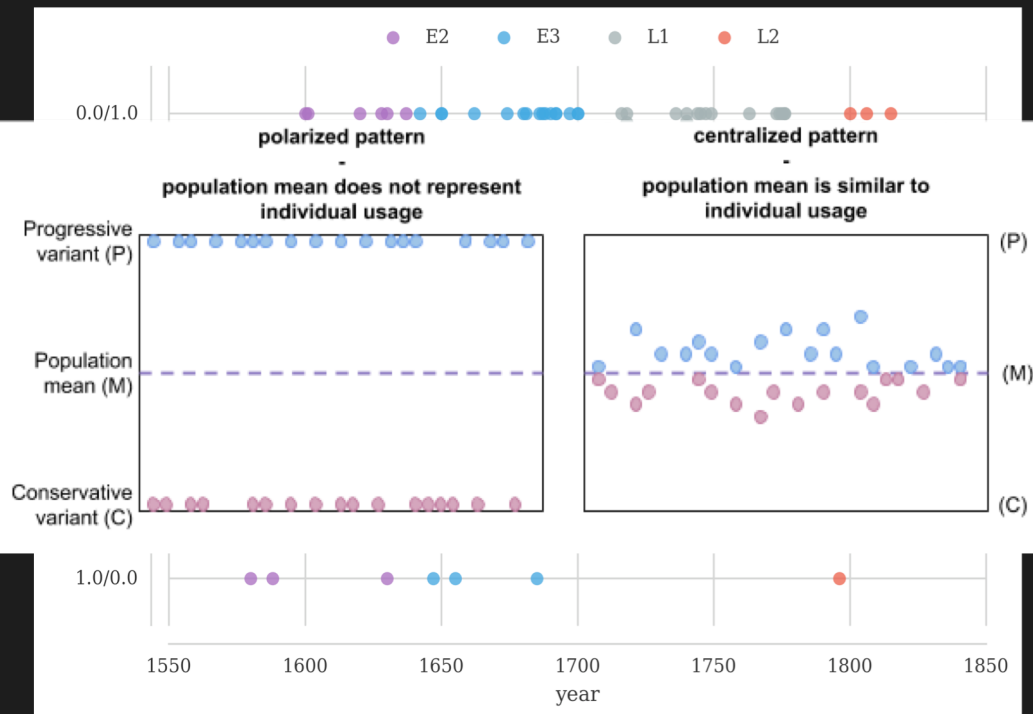


### Modern English

Gradual spread of the *of*-less variant (Fanego 2004) to new syntactic environments



## Variable users?



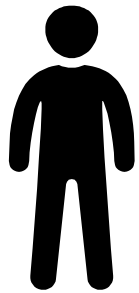
(Figure taken from Fonteyn (2017) – data from PPCEME and PPCMBE)

- The rise of gerunds with direct objects is a slow, gradual change of an abstract pattern, with “a **significant fraction** of mixed-usage speakers throughout the change” (Baxter & Croft 2016: 165; Nevalainen et al. 2011)
- Thus, we observe a **centralized** pattern.
- Suggestion of **homogeneity**: individual usage resembles the population level mean in such cases.

### However:

- These are very simple statistics that do not take into account whether (and how) each individual conditions variation.
- Not every 50-50 distribution is the same...

Andrea



BY	THROUGH
<i>by reading books</i>	<i>through reading of books</i>

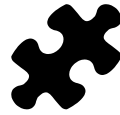
50% VG – 50% NG

Lauren



BY	THROUGH
<i>by reading of books</i>	<i>through reading books</i>

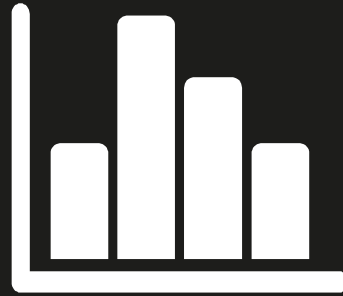
50% NG – 50% VG



## RESEARCH QUESTIONS

- How consistently do speakers in a population converge on the same constraint effects on linguistic variables? Do we observe ‘**individual conditioning**’ of (syntactic) variation? (Guy 2015; Mackenzie 2019)
- If so, how/where does that individuality reveal itself in the individual’s linguistic behavior?





## **DATA AND ANALYSIS**



## CORPUS

### **Early Modern Multiloquent Authors** (EMMA; Petré *et al.* 2018)

- Sample of 50 of the most prolific English writers born in the 17th century (mostly belonged to the London-based elite)
- 5 generations

### **In this study:**

- 19 randomly selected speakers, born between 1600 and 1645 (3 generations)
- Focus on *prose* and *letters*
- 14,078 gerunds



## DATA SET - GENERAL

Generation 1 (◦1599 – 1613)	Generation 2 (◦1621 – 1627)	Generation 3 (◦1639 – 1644)
OF: 1349 (40.90%)	OF: 1148 (29.98%)	OF: 1496 (21.52%)
Ø: 1949 (59.10%)	Ø: 2681 (70.02%)	Ø: 5455 (78.84%)

Generation 1 (1599 - 1613)		Generation 2 (1621 - 1627)		Generation 3 (1639 - 1644)	
Heylyn, Peter	OF: 344 (46.17%) Ø: 401 (53.83%)	Boyle, Roger	OF: 79 (29.15%) Ø: 192 (70.85%)	Mather, Increase	OF: 201 (23.93%) Ø: 639 (76.07%)
Prynne, William	OF: 496 (47.06%) Ø: 558 (53.83%)	Pierce, Thomas	OF: 91 (23.58%) Ø: 295 (76.42%)	Crouch, Nathaniel	OF: 197 (19.64%) Ø: 806 (80.36%)
Fuller, Thomas	OF: 172 (38.83%) Ø: 271 (61.17%)	Fox, George	OF: 213 (35.80%) Ø: 382 (64.20%)	Behn, Aphra	OF: 18 (6.57%) Ø: 256 (93.43%)
Milton, John	OF: 235 (40.94%) Ø: 339 (59.06%)	Boyle, Robert	OF: 79 (13.30%) Ø: 515 (86.70%)	Burnet, Gilbert	OF: 509 (20.72%) Ø: 1948 (79.28%)
Taylor, Jeremy	OF: 102 (21.16%) Ø: 380 (78.84%)	Swinnock, George	OF: 55 (17.35%) Ø: 262 (82.65%)	Penn, William	OF: 571 (24.02%) Ø: 1806 (75.98%)
		Bunyan, John	OF: 401 (51.74%) Ø: 374 (48.26%)		
		Flavell, John	OF: 58 (26.01%) Ø: 165 (73.99%)		
		Tillotson, John	OF: 82 (31.78%) Ø: 176 (68.22%)		
		Dryden, John	OF: 90 (21.95%) Ø: 320 (78.05%)		



## GENERAL MODELS

Rather than controlling for individual variation (cf. Gries & Hilpert 2010), this study wishes to determine:

- (i) the extent of individual variation
- (ii) how/where individuals differ

**Conditional inference tree** (binary splits until no longer justified)

- **cforest**(gerund ~ **age + author + det + func + generation + genre + verb\_type**, data=df)

**Random forest** (1000 conditional inference trees contribute to final model)

- **cforest**(gerund ~ **age + author + det + func + generation + genre + verb\_type**, data=df, controls=cforest\_control(mtry = 6, ntree=1000))



Determiner	Function	Verb Type	External
<p><b>BARE</b></p> <ul style="list-style-type: none"> <li>By <math>\emptyset</math> destroying Souls, he ...</li> </ul> <p><b>POSS</b></p> <ul style="list-style-type: none"> <li><b>his</b> fearing God more then Man was ...</li> </ul> <p><b>THE</b></p> <ul style="list-style-type: none"> <li><b>The</b> seeing of our Friends in Heaven will ...</li> </ul> <p><b>A</b></p> <ul style="list-style-type: none"> <li>a cry will be among you, and <b>a</b> wishing you had never been born</li> </ul> <p><b>QUANT</b></p> <ul style="list-style-type: none"> <li>... <b>no</b> reverencing of images</li> </ul> <p><b>DEM</b></p> <ul style="list-style-type: none"> <li><b>This</b> forgetting of the God that saves us ...</li> </ul>	<p><b>BY, IN, FOR, OF, TEMP, ...</b></p> <ul style="list-style-type: none"> <li><b>by</b> onely torturing of men</li> <li><b>in</b> the destroying of the ...</li> <li><b>after</b> his blaspheming Shakespeare.</li> </ul> <p><b>OBJECT</b></p> <ul style="list-style-type: none"> <li>I would seriously <b>recommend</b> the Arming of our Pikemen</li> </ul> <p><b>SUBJECT COMPLEMENT</b></p> <ul style="list-style-type: none"> <li>... that <b>there</b> should <b>be</b> christening of children</li> <li><b>It is</b> not the giving out of mercy that troubles him, but ...</li> </ul> <p><b>SUBJECT</b></p> <ul style="list-style-type: none"> <li>The laying down of life <b>did</b> abundantly proclaim his love</li> </ul>	<p><b>LEX</b></p> <ul style="list-style-type: none"> <li>... whilst others make them groan, by <b>abusing</b> them to sin, and <b>subjecting</b> them to their lusts.</li> </ul> <p><b>'LIGHT'</b></p> <ul style="list-style-type: none"> <li>He is accus'd of Malevolence, and of <b>taking</b> Actions in the worst Sence</li> <li>... that prayers, and supplication, and <b>giving</b> of thanks be made for all men</li> </ul> <p><b>HAVE</b></p> <ul style="list-style-type: none"> <li>there is more required to make a good Scholler, then onely the <b>having</b> of many bookes</li> </ul>	<p><b>GENERATION</b></p> <ul style="list-style-type: none"> <li>G1</li> <li>G2</li> <li>G3</li> </ul> <p><b>AGE</b></p> <ul style="list-style-type: none"> <li>Numeric <ul style="list-style-type: none"> <li>Age of author at time token was produced</li> </ul> </li> </ul> <p><b>GENRE</b></p> <ul style="list-style-type: none"> <li>letters</li> <li>Prose</li> </ul> <p><b>AUTHOR</b></p> <ul style="list-style-type: none"> <li>19 levels</li> </ul>

Factors based on Fanego (2004), De Smet (2013) & Fonteyn (2019)



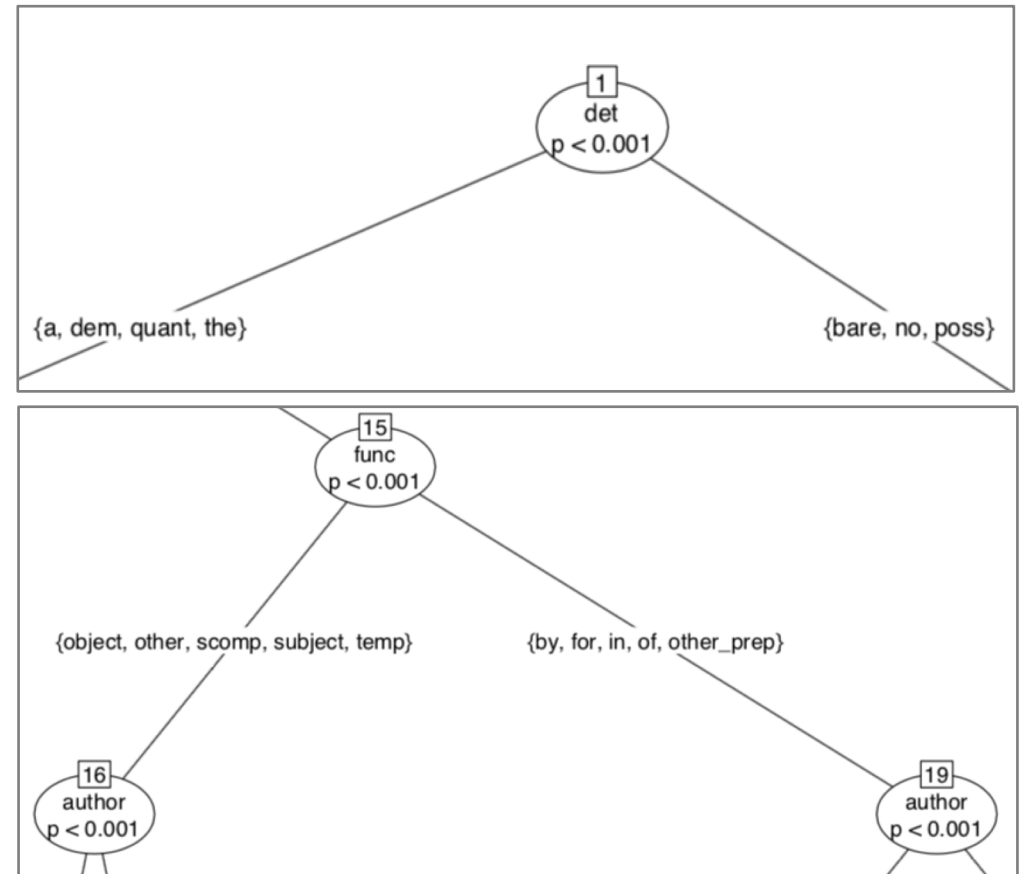
**RESULTS**

### Model residuals

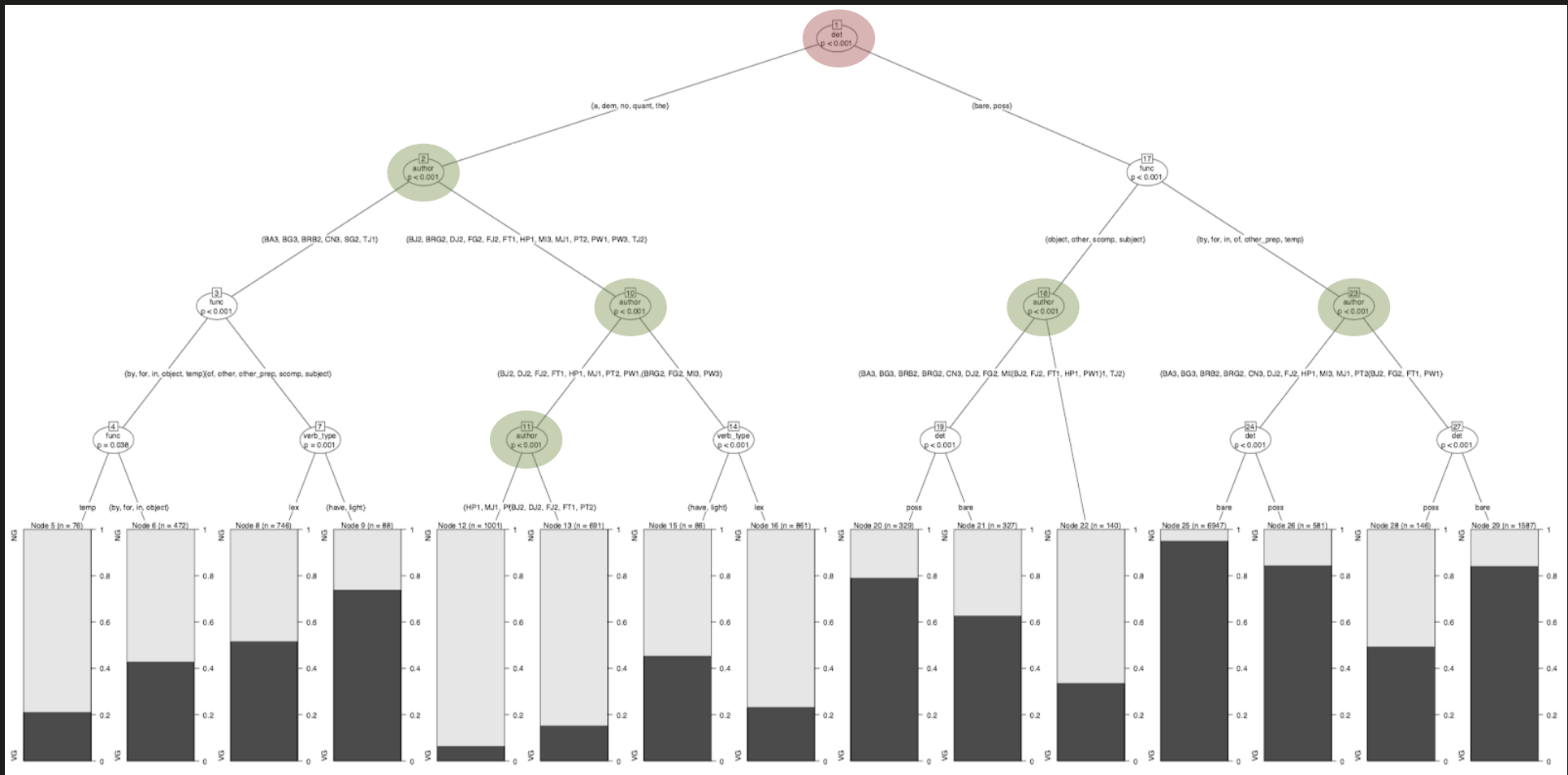
Accuracy 0.85  
AUC 0.81

### Binary splits

- (1) determiner  
{a, the, dem} vs. {bare, no, poss}
- (15) within {bare, no, poss}  
> split: function  
{prepositions} vs. {other + temp}





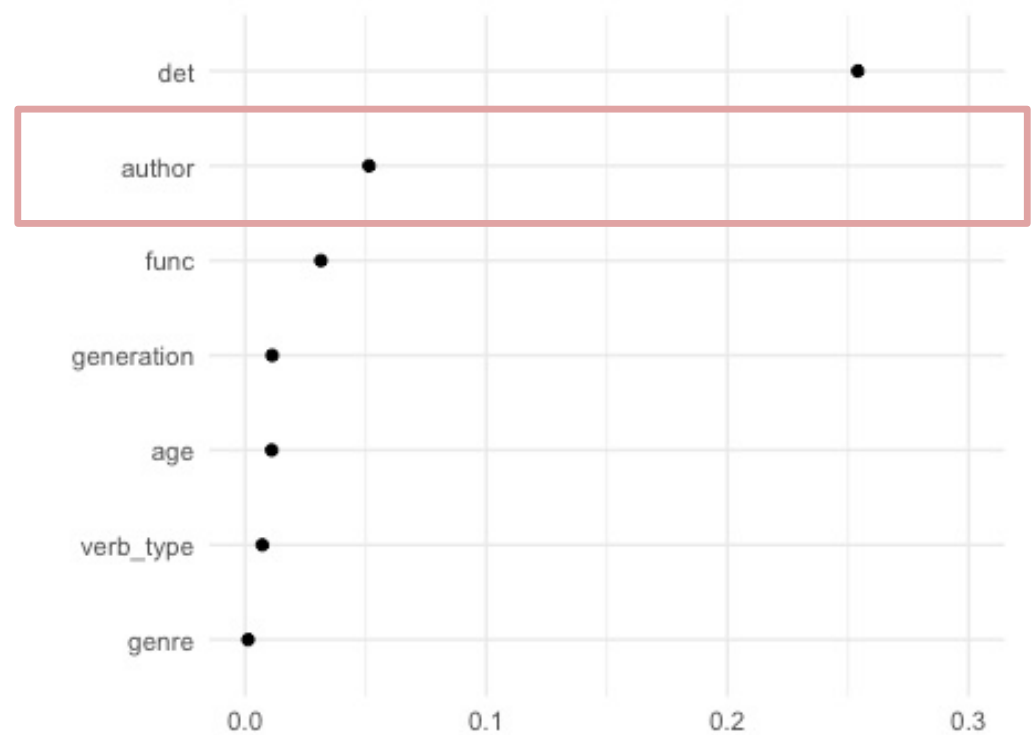


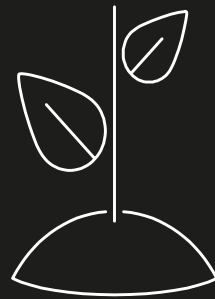
### Model residuals

Accuracy 0.86  
AUC 0.81

### Variable importance

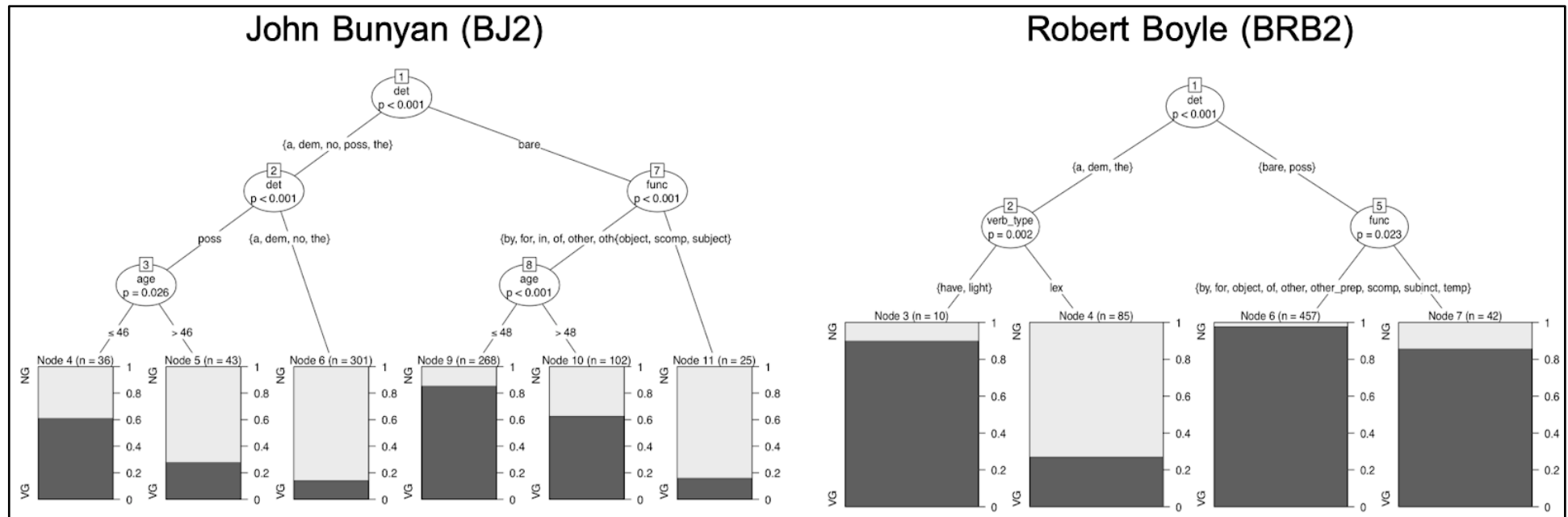
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author	0.051
func	0.032
generation	0.011
age	0.011
verb_type	0.007
genre	0.001



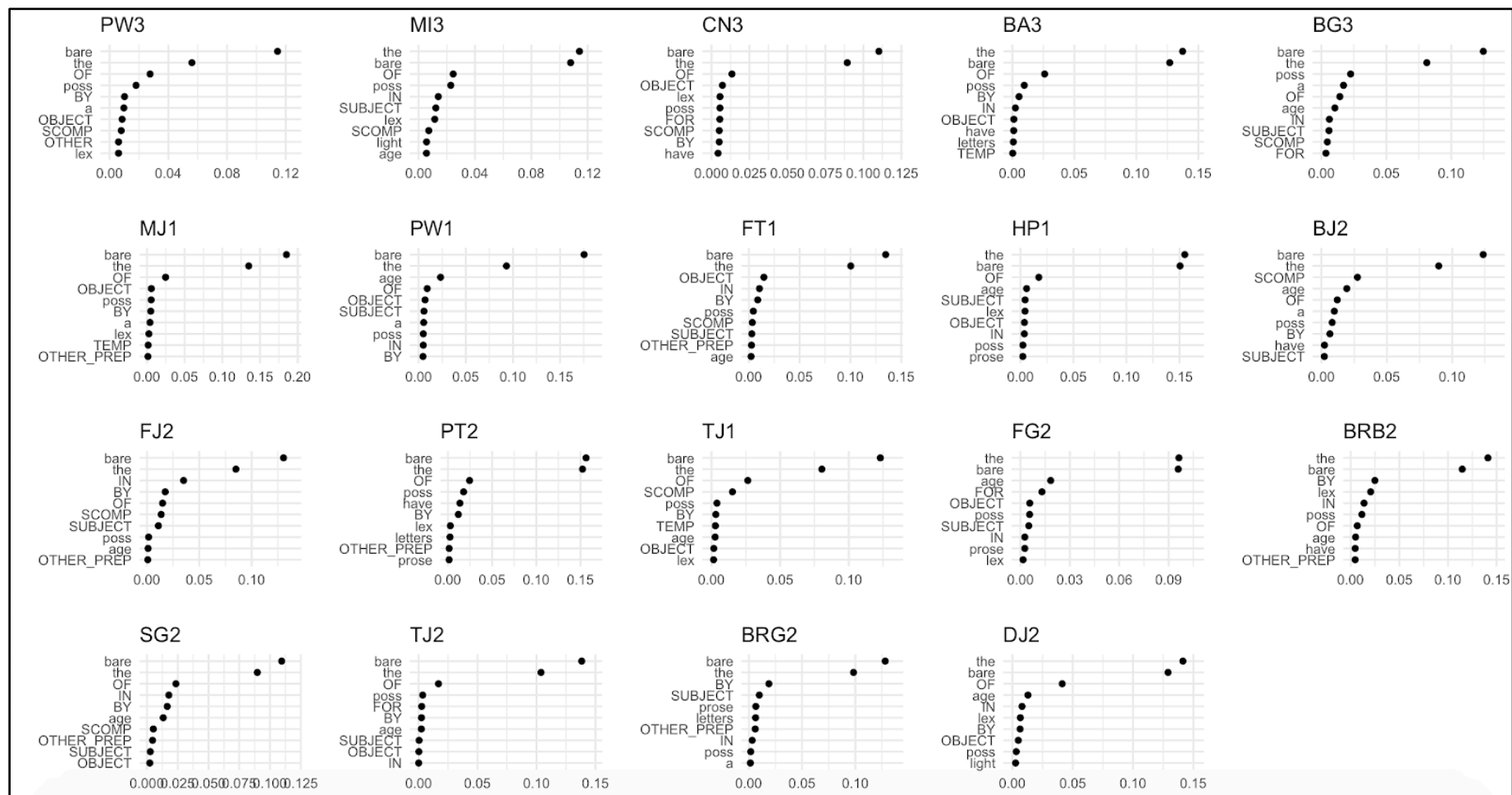


# **INDIVIDUAL MODELS**

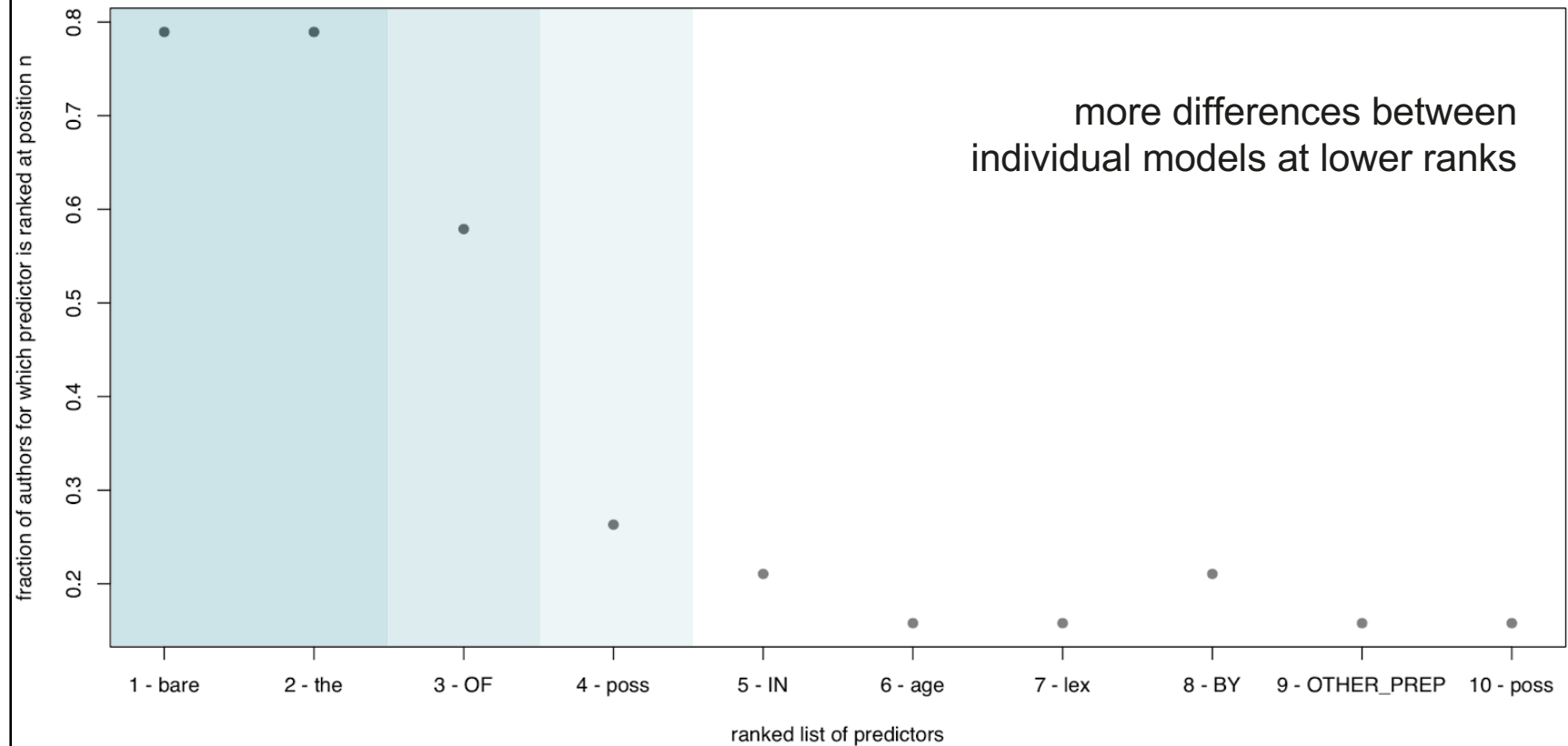
# BARE + SUBJECT

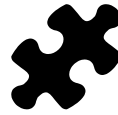


<b>Robert Boyle</b>	1675	generation 2	Ø	... embracing... or not	embracing	this Religion, is an act of humane choice
<b>John Bunyan</b>	1685	generation 2	OF	Thus you see,	breaking	of bread, was the work



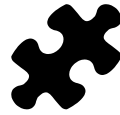
## DENSITY OF SHARED CONSTRAINTS AT RANK N





## CONCLUSIONS

- Even with centralized patterns of variation and change, there can still be substantial heterogeneity in terms of how individual language users condition the (syntactic) alternation pair in flux.
- These results can be explained by the fact that **different individuals** can come across different exemplars of the competing constructions, and consequently will build slightly **different cognitive models** (e.g. Dabrowska 2012).
- Yet, at the same time, there are clearly some **generalizations** that can be made across all authors in the sample.  
e.g. <nominal determiners> vs. <bare, poss>



## CONCLUSIONS

- The post hoc analysis helped determine **the locus** of this individual variance:
  - individuals appear to behave homogeneously with regard to a very select number of (obvious) grammatical contexts,
  - but as the personalized models become more specific, including more (interacting) factors, they also become more idiosyncratic.





**THANK YOU.**

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