

A glimpse into sign language corpus linguistics

the WHAT, the HOW & the WHY

Carl (Calle) Börstell

University of Bergen

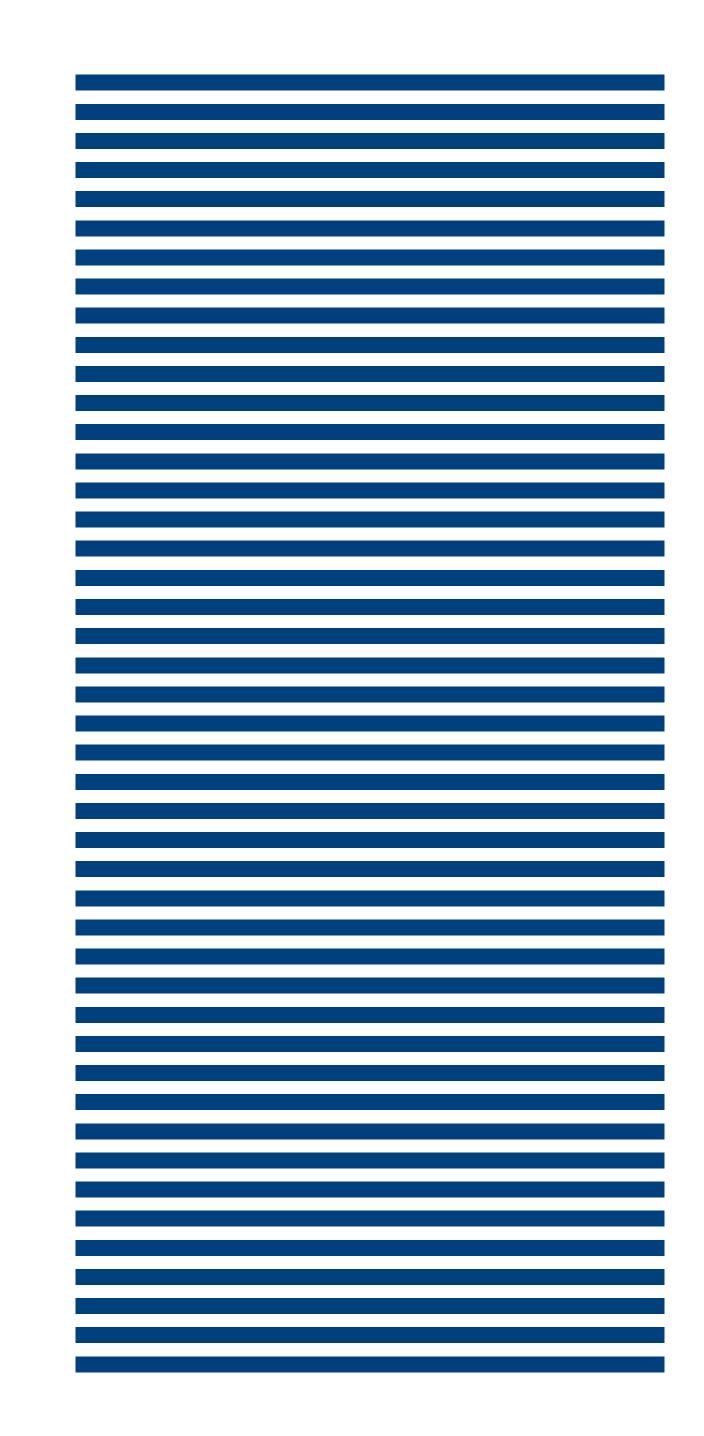
LINNORD

Nordic Innovations in Linguistics: Multi-method approaches for understanding language

Jyväskylä, March 20–21, 2025







My research

Probably 99% of my research is mainly on signed languages

Early: typologically-oriented descriptive linguistics

Then: iconic patterns across languages and modalities

Now: distributional patterns in corpora + computer vision

I think ~80% is based on corpus data in some form



Today's presentation

Today's presentation topics



What is corpus linguistics in sign language research?

What research questions can we answer with current data?

How do we extract and process the data with these goals in mind?

Why do we want to use corpus data - or not?



Introduction

The Quantitative Turn

In the past 25 years, linguistics has become more quantitative

More data: corpora



More control: experiments



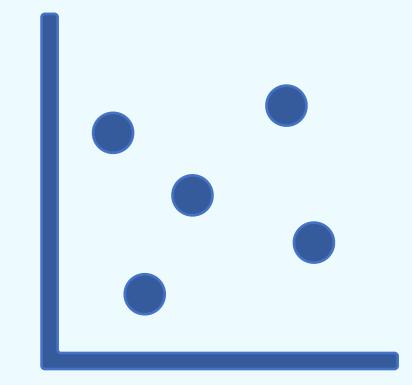
More complex methods: statistics





Quantitative sign linguistics

The field has followed this general trend



However...

... still small datasets (few participants) also in experiments (small pools)

... SL corpora have been built from scratch (technically challenging)

Corpus-based or corpus-driven

Corpus-based research

- corpus is used to test and verify theoretical claims



Corpus-driven research

- corpus itself is the source from which patterns are identified



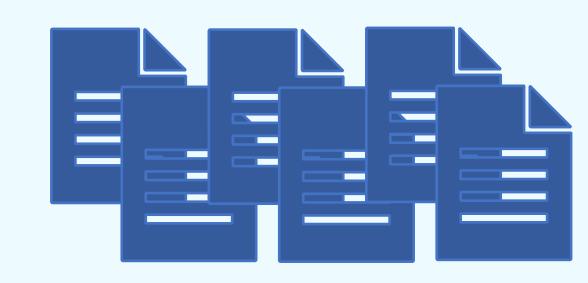
SL work has been mostly corpus-based, but some corpus-driven?

- corpus size, balance and representativeness are issues here



What is a corpus?

Data(base) ≠ corpus



A collection of natural(istic) texts

Machine-readable transcriptions: written, spoken or signed

Should be **large enough**; can target a specific purpose ... anything <1 million words is often seen as small

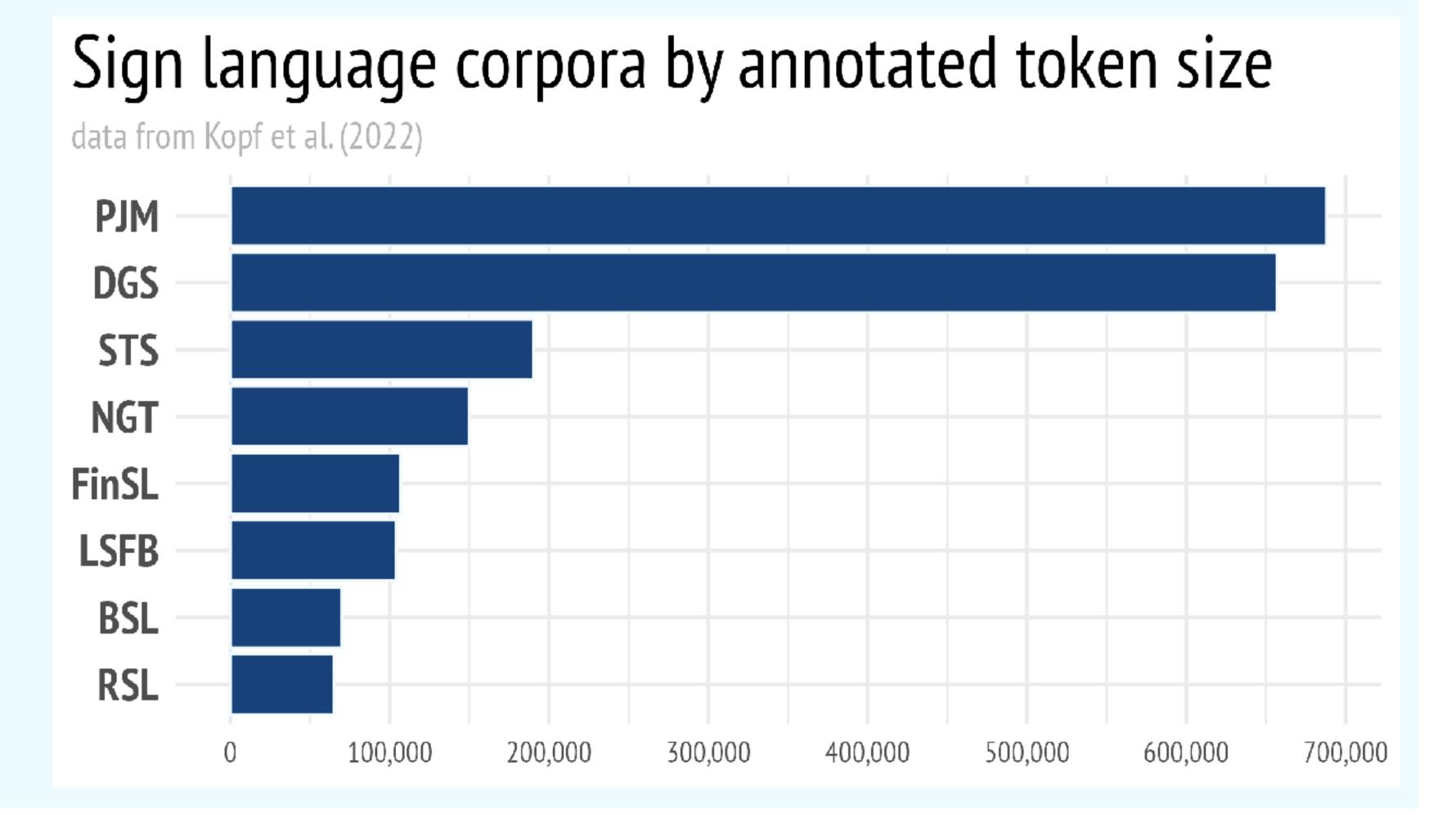


Sign language corpora today

Only two sign language corpora that are equivalent in size to (smaller) spoken language corpora: Polish SL (PJM) and German SL (DGS)

What does this mean for research?

Kopf et al. (2022)

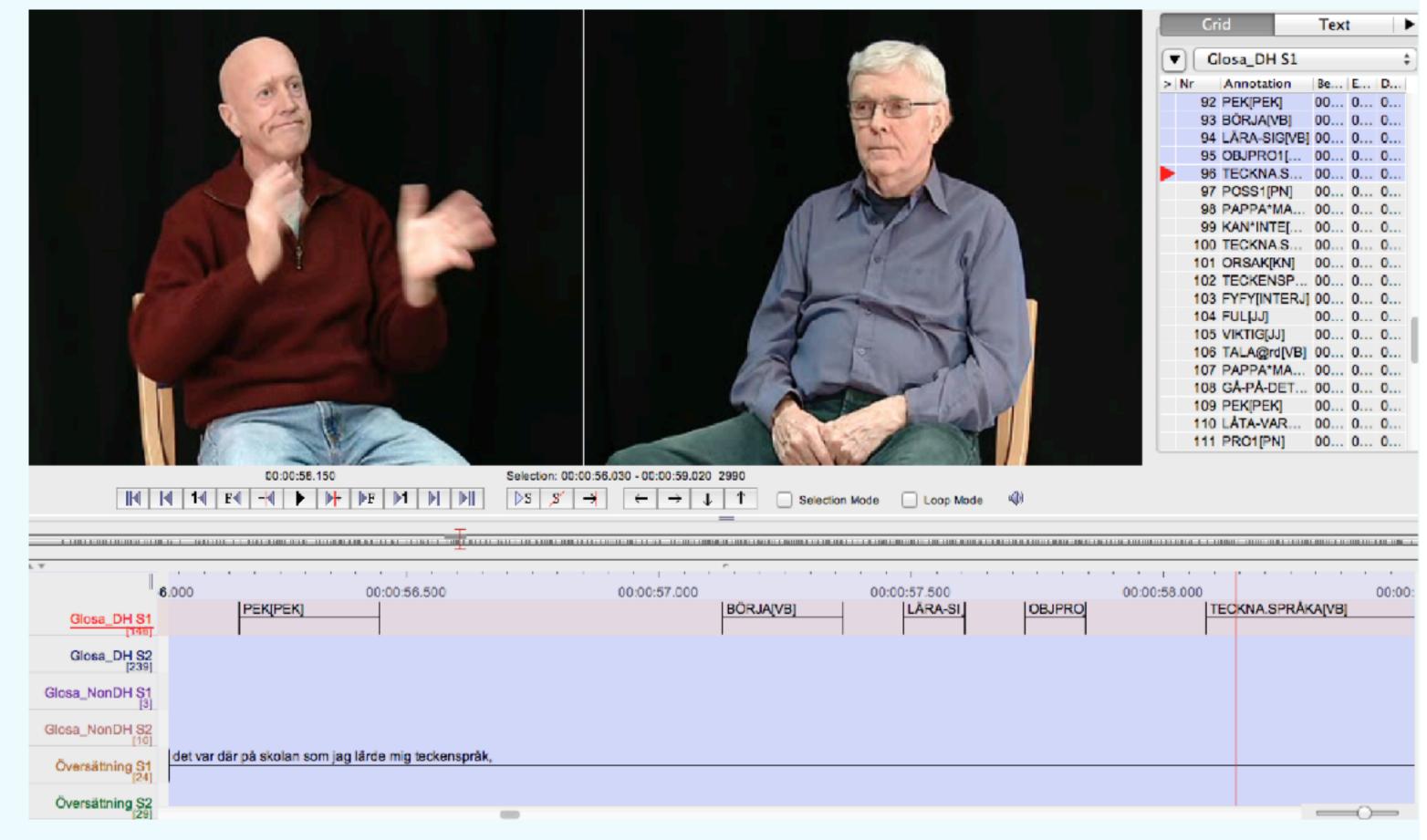


Sign language corpora

Most sign language corpora use **ELAN for annotation**

ELAN is also the main tool for viewing and searching the corpus

Basic interface and annotations: signs + translations (here STS)



Mesch et al. (2012); Öqvist et al. (2018)

the WHAT & the HOW

What data do SL corpora have?

Lexical: Segmentation + gloss annotation of individual signs



Translations: written (or spoken) translations into a spoken language

Metadata: sociolinguistic profile of signers

Other: morphology (limited), form-descriptors (hs, #hands), pose



What data do SL corpora lack?

Morphology: Reference, modification, lemmas (cf. DGS)

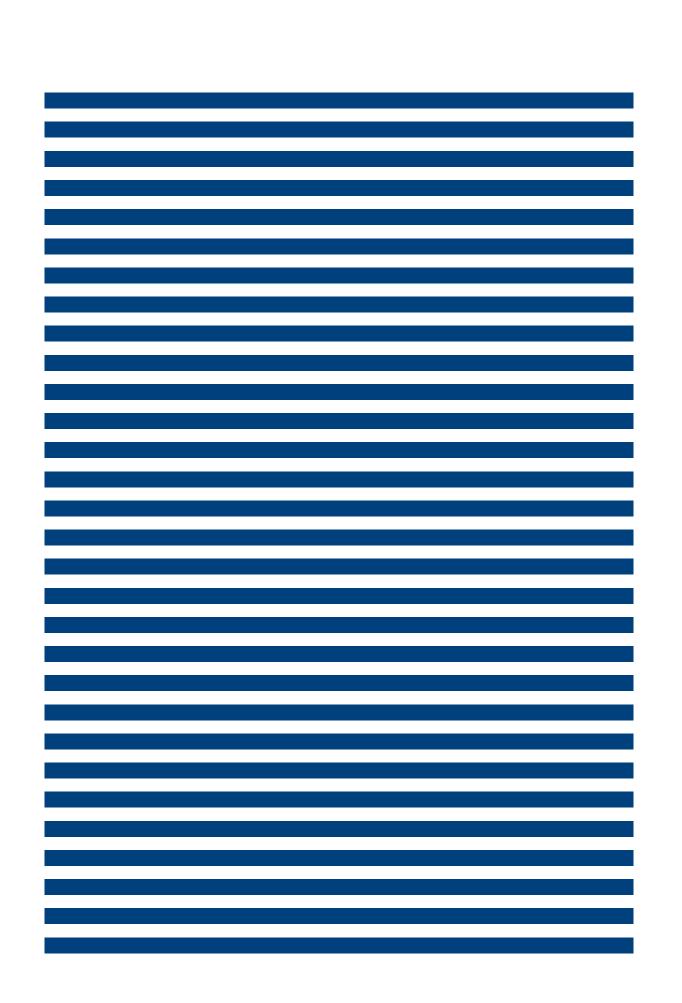
Syntax: segmentation and dependencies (cf. Auslan & STS)

Discourse: interactional segmentation + functions

Tools: user-friendly search tools for frequency, concordances and context

Östling et al. (2017); Börstell (2022; 2024a,b); Fenlon & Hochgesang (2022); Kopf et al. (2022)

Frequency



Lexical frequency in sign languages

One of the first and easiest things to look at in a corpus



Some of the earliest papers used a "corpus"

- ASL data was 4,000 sign tokens
- NZSL used text transcriptions (but: 100,000 tokens)

With first "real" SL corpora, lexical frequencies were investigated

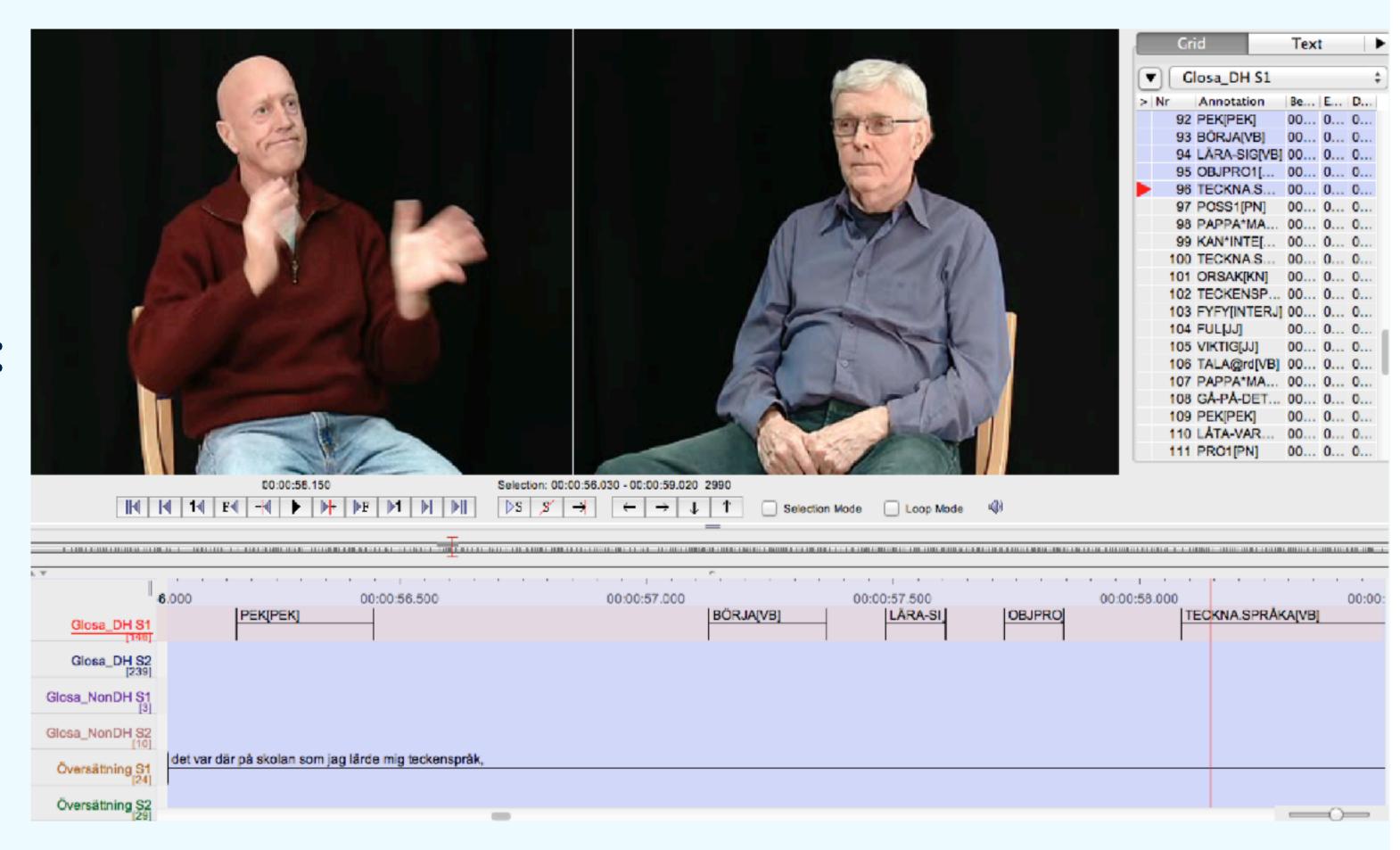
- text type influences sign types: depiction more in narratives

Lexical frequency in STS

We (5th?) could compare STS sign frequencies with previous research

Similar frequency patterns:

- functional (points, etc.)
- culturally relevant concepts (e.g., DEAF)
- sign type ↔ text type



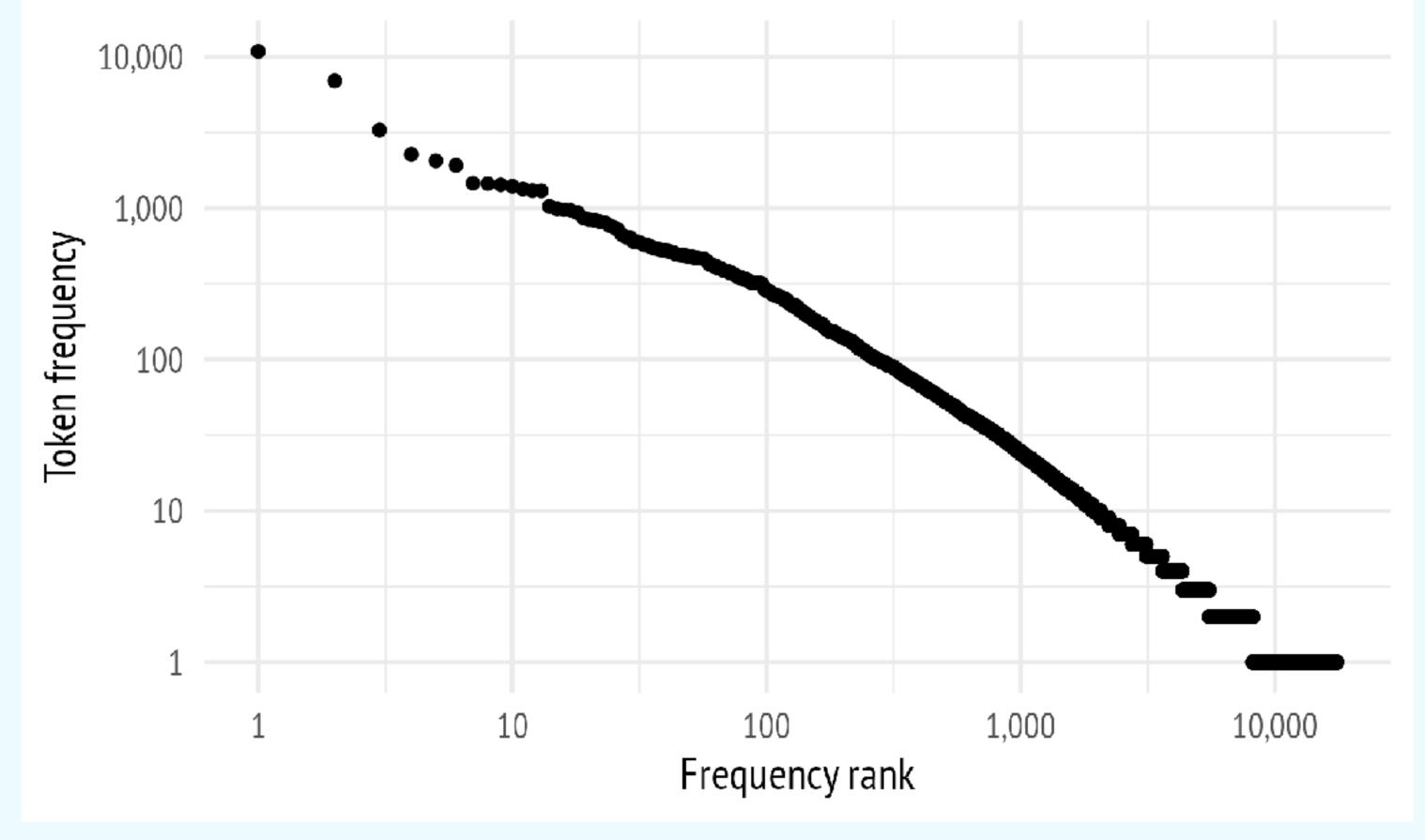
Lexical frequency in STS

We could also (1st?) show that STS lexical frequency showed a **Zipfian distribution** (expectedly)

The frequency rank (1st, 2nd, 3rd, ...) is inversely correlated with the token frequency of signs

Börstell et al. (2016); Zipf (1935); see also Kimchi et al. (2023)



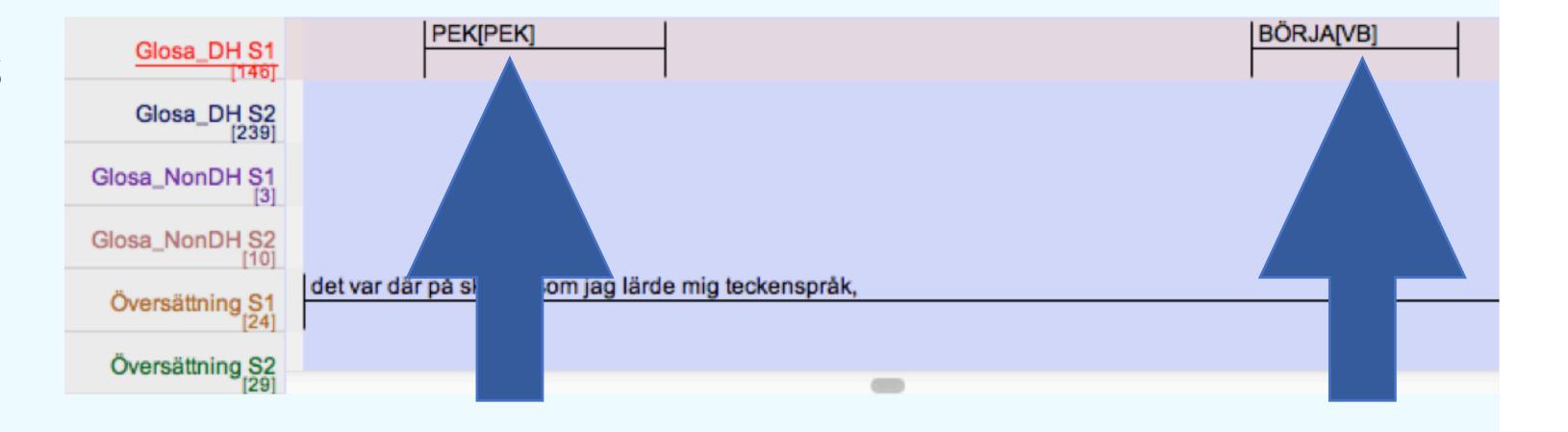


Word class in STS

In 2015, we word class (or part-of-speech)
annotated the STS corpus

Often misunderstood, but our semi-automatic approach was manually corrected (~3,000 types)

- done on the type-level





Word class in STS

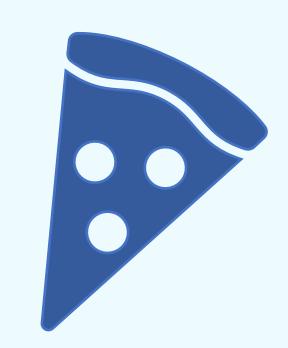
With these word class annotations, we could also look at frequencies on a "higher level"

Expected patterns:

- Content classes have more types to tokens
- Function classes have more tokens to types

Category	Word class	Types	Tokens
content	noun	4,878	28,579
	verb	3,752	42,794
	adjective	692	8,211
	adverb	522	18,337
function	pronoun/point	446	31,190
	preposition	77	3,382
	conjunction	60	4,356
	article	5	7
other	depict/CA	2,263	9,383
	numeral	393	4,246
	gesture	130	5,154
	interjection	111	7,627 2,602
	buoy	70	2,602

Lexical variation



With signer metadata, we can also look at lexical variation

In practice: this is difficult!

- "small" corpora = few relevant items
- without targeted topics/themes, content varies

We have tried to identify candidates from the data, but it is hard!

- a combined approach may be best



Lexical variation

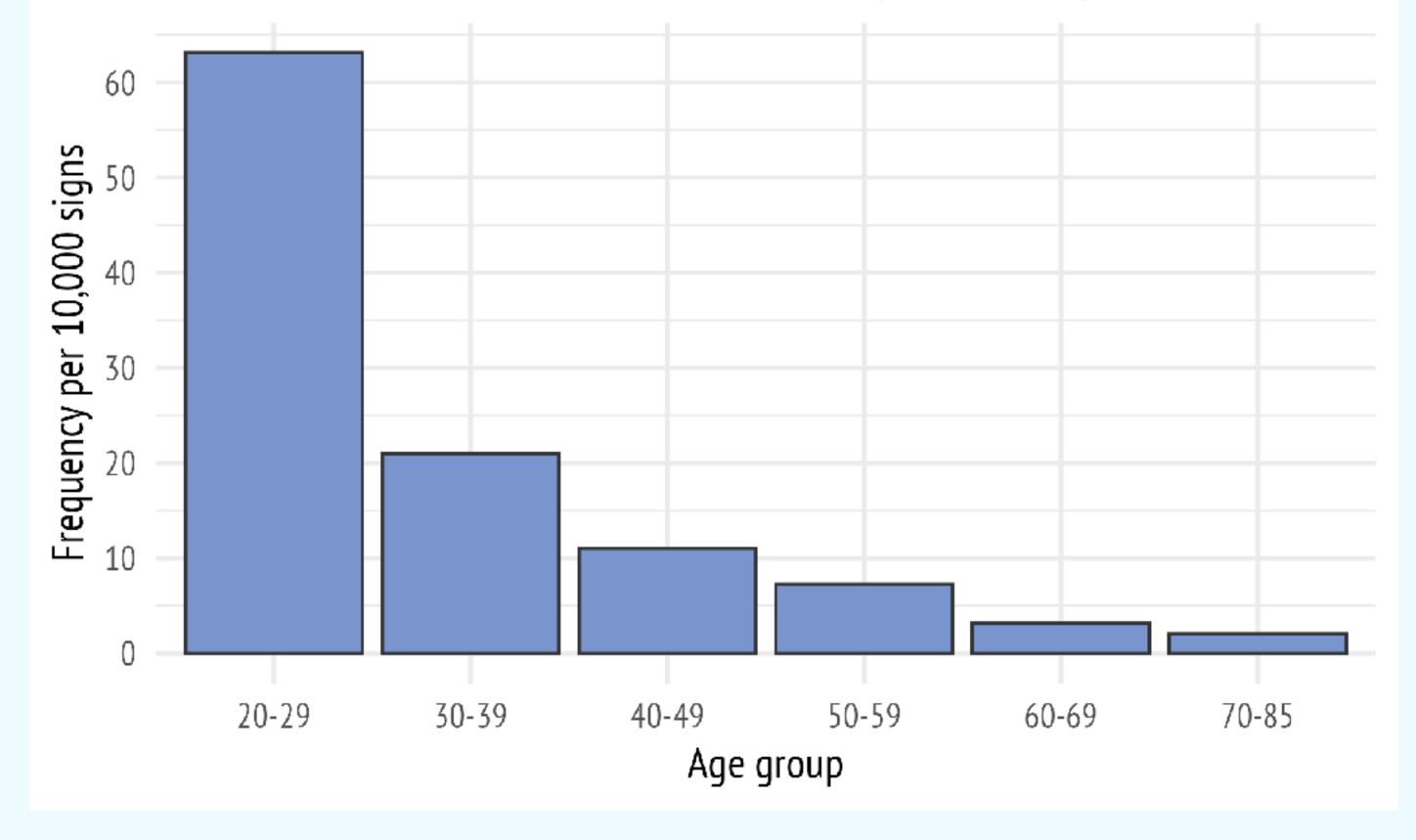
Easier when

- you know specific candidates
- they are frequent
- they are themselves or with variants dispersed across signers

Example: the sign TYP@b →

Börstell & Östling (2017); Börstell (2024)





Lexical variation

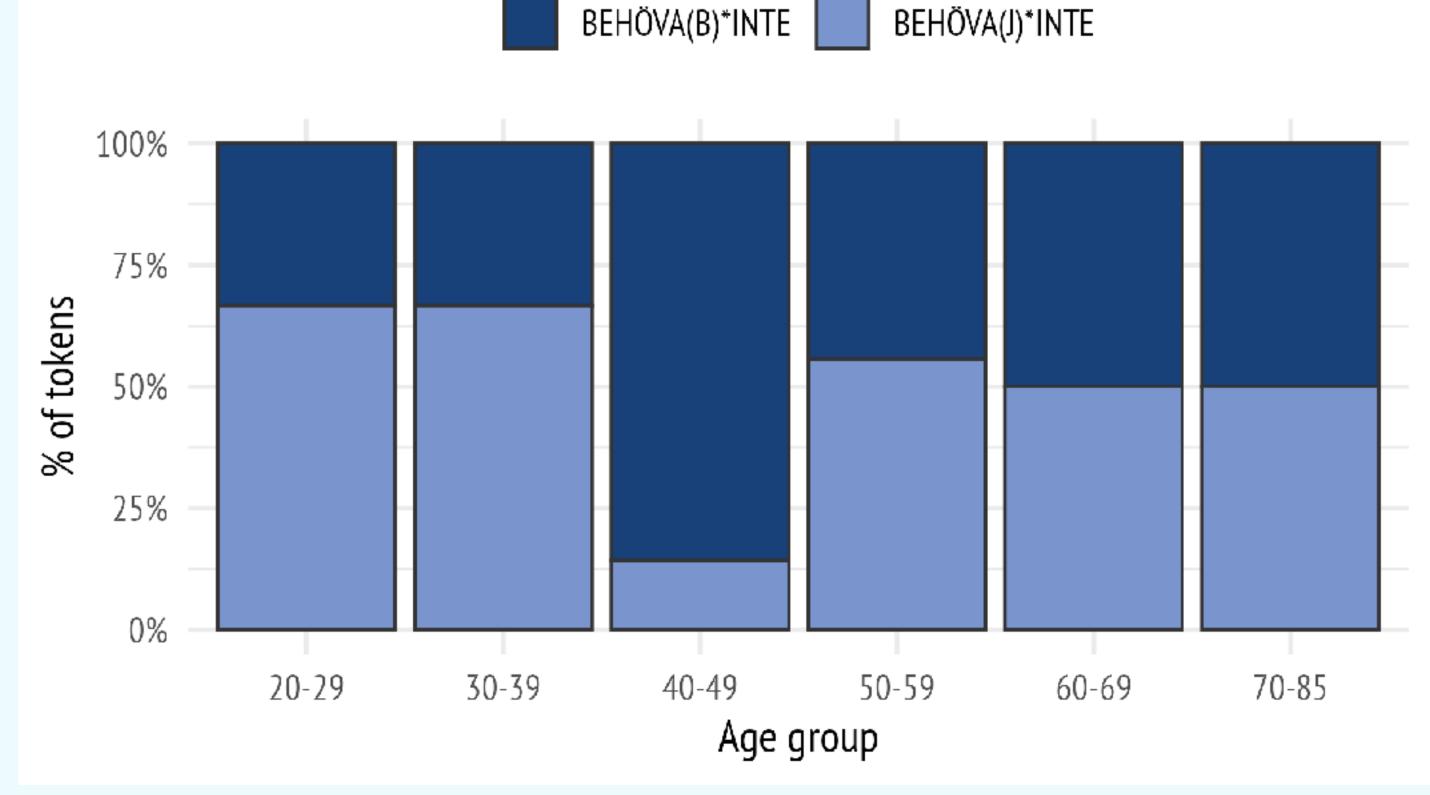
Easier when

- you know specific candidates
- they are frequent
- they are themselves or with variants dispersed across signers

Example: BEHÖVA(**B** or **J**) →

Börstell & Östling (2017); Börstell (2024)





Frequency: how



Exported (and imported) sign annotations from ELAN

Count number of occurrences per sign gloss

- may involve some trimming/lemmatizing!

LOOK LOOK++ LOOK>left
LOOK

Extract word class tags from sign glosses

Count number of types per word class

Count total tokens per word class





Börstell (2022); Börstell et al. (2016)

Lexical variation: how



Count number of occurrences per sign gloss

Combine data with metadata (age, gender, region, etc.)

Trim and match with meanings or lemmas

Normalize as rate (frequency relative to signer/group total)

Targeted **topics/texts** for specific items

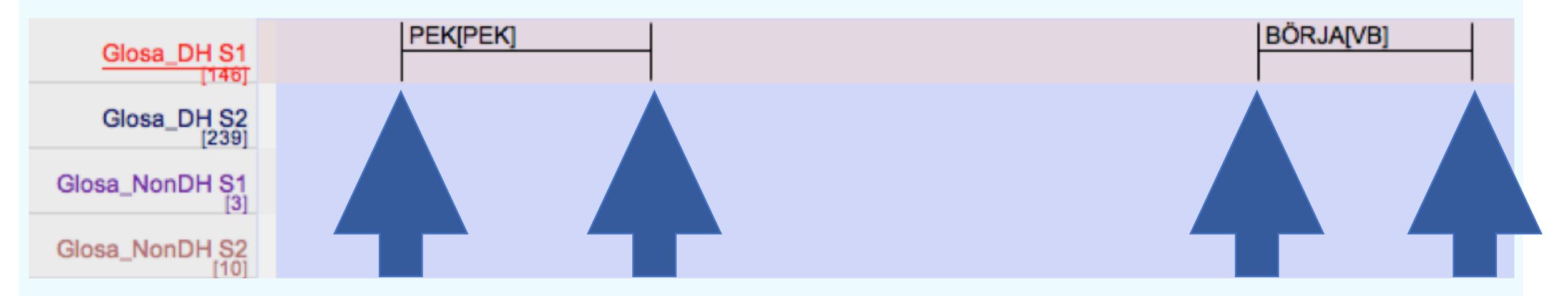
Targeted interviews or **tasks** for specific items





Duration & articulation rate

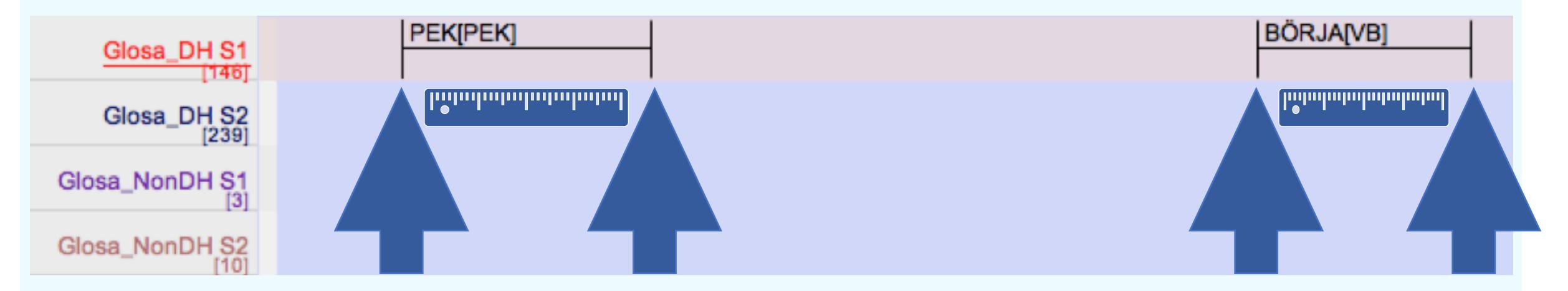
But wait, those annotations have an extension in time!





But wait, those annotations have an extension in time!

- this means we get durations for free!





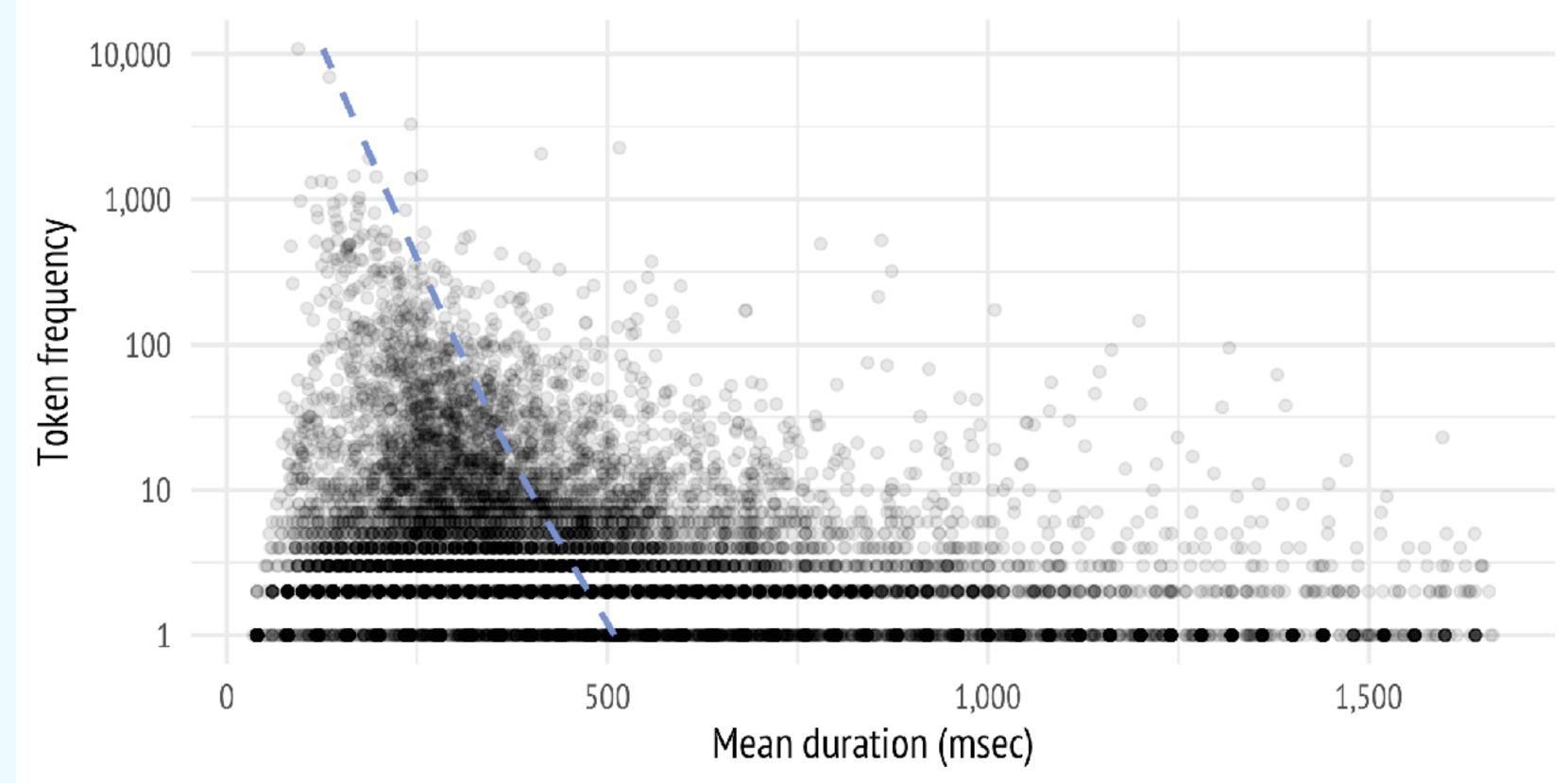
We took the durations in ELAN and found:



We took the durations in ELAN and found:

1) More frequent = shorter duration

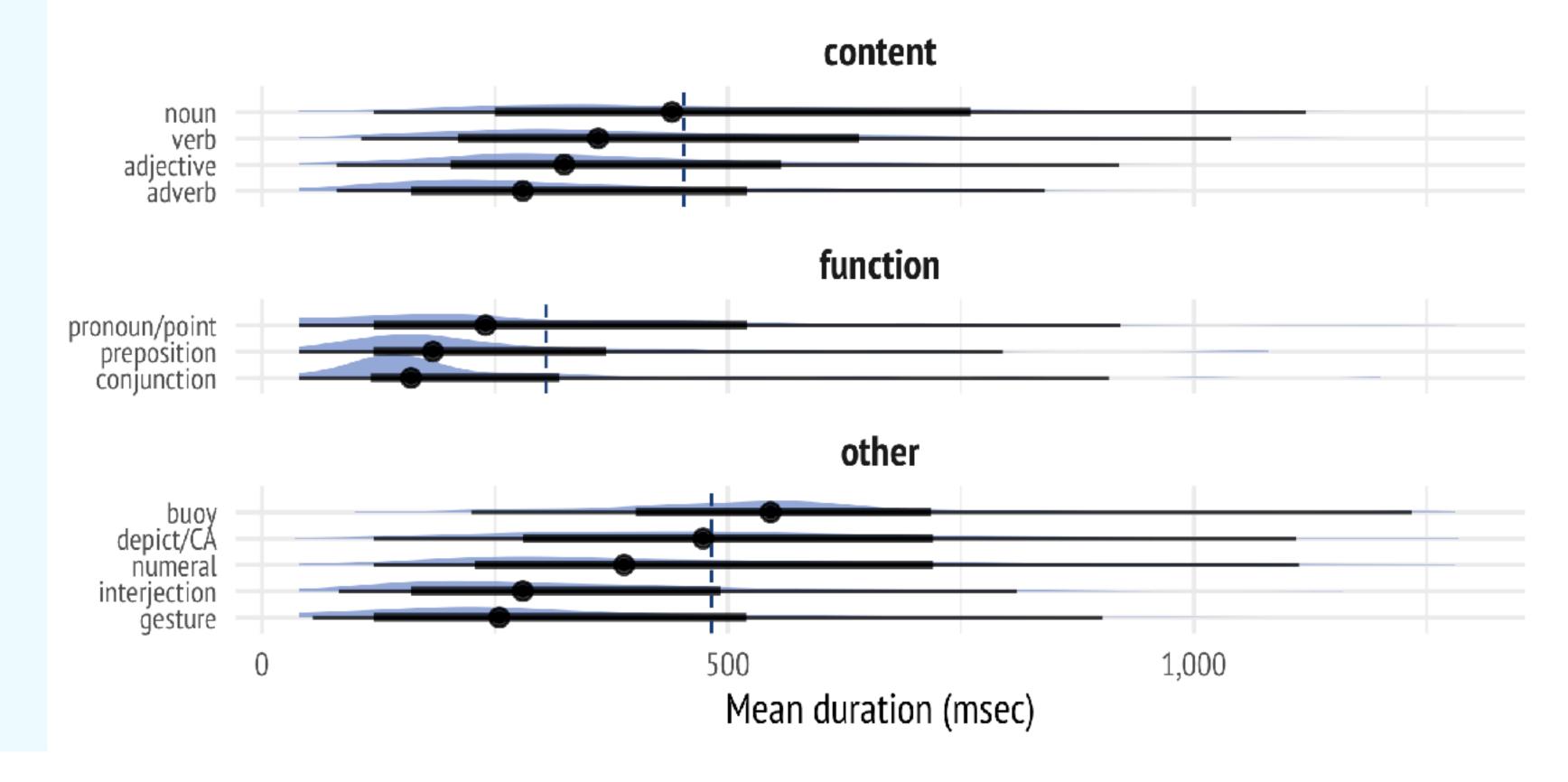
Sign frequency and duration in STS



We took the durations in ELAN and found:

- 1) More frequent = shorter duration
- 2) Content word classes > functional

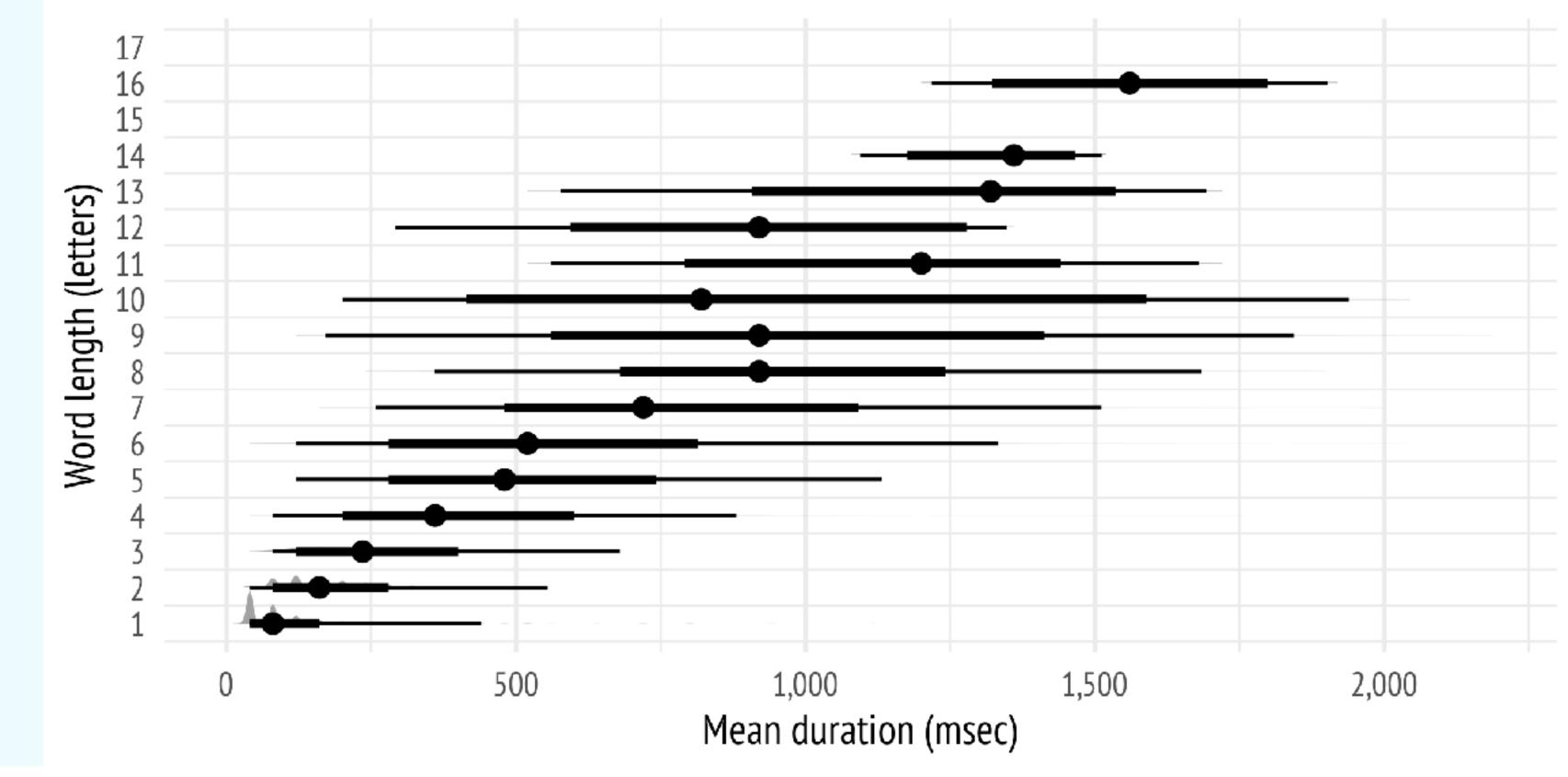
Word classes and duration in STS



We took the durations in ELAN and found:

- 1) More frequent = shorter duration
- 2) Content word classes > functional
- 3) Fingerspelling duration ↔ length

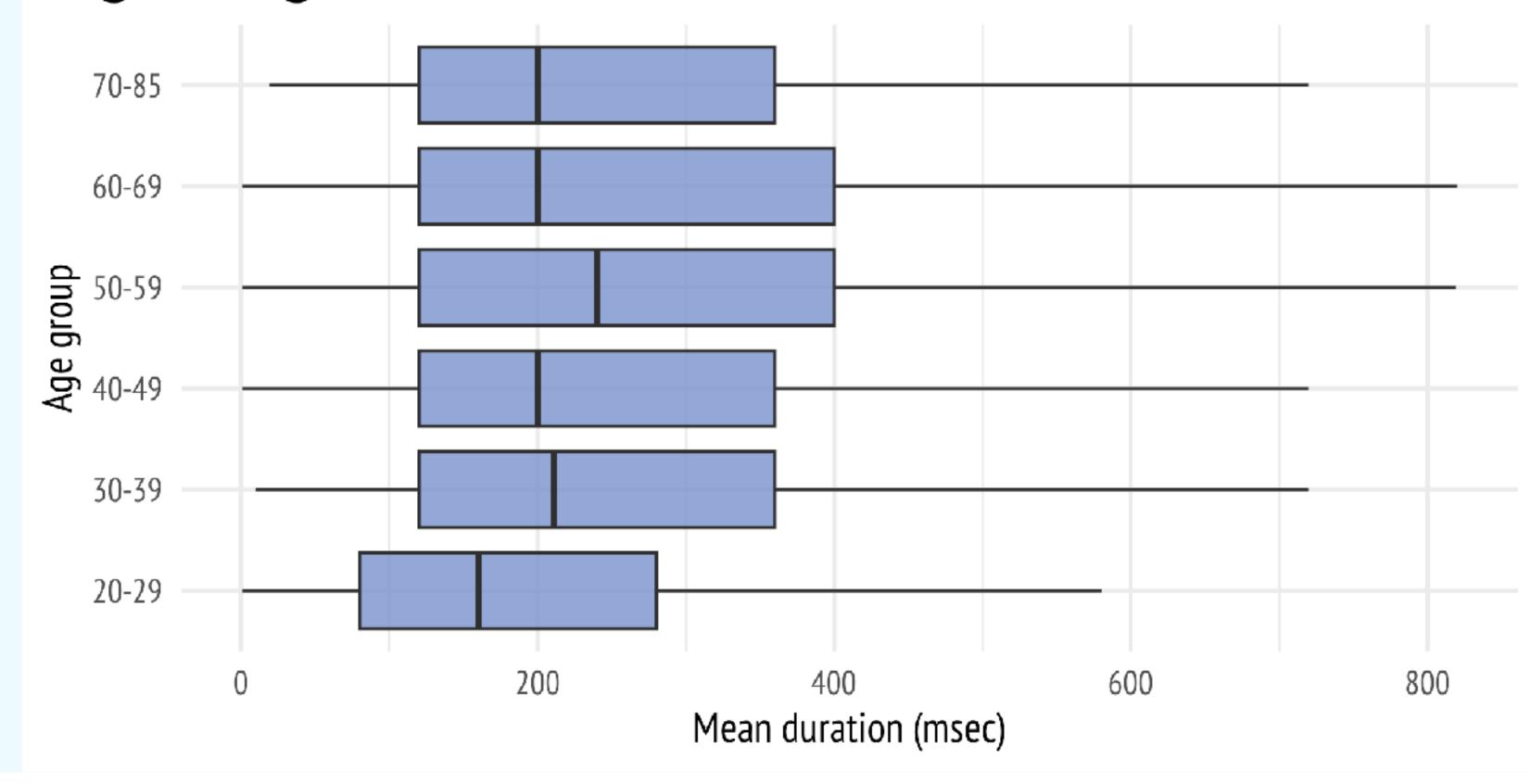
Fingerspelled word length and duration in STS



We took the durations in ELAN and found:

- 1) More frequent = shorter duration
- 2) Content word classes > functional
- 3) Fingerspelling duration ↔ length
- 4) age → duration

Signer age and duration in STS

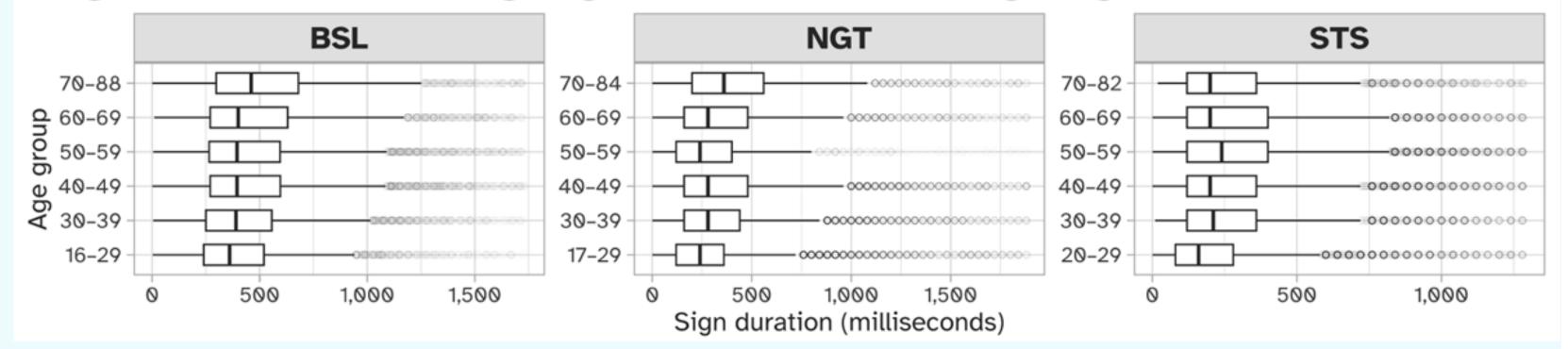


Signing rate in BSL, NGT and STS

We replicated and added to this with three SL corpora:

1) age → duration

Sign duration by age group across languages



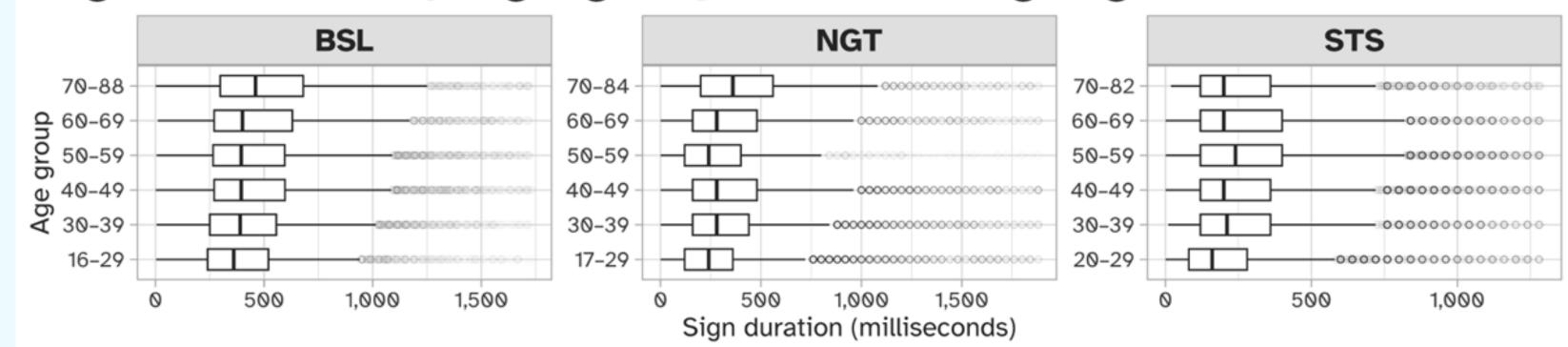


Signing rate in BSL, NGT and STS

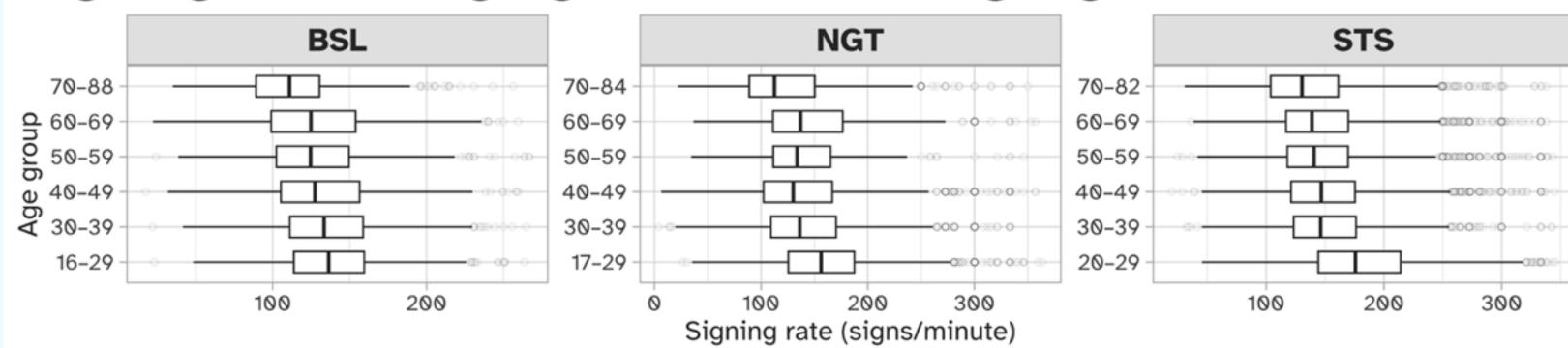
We replicated and added to this with three SL corpora:

- 1) age → duration
- 2) age → rate

Sign duration by age group across languages



Signing rate by age group across languages

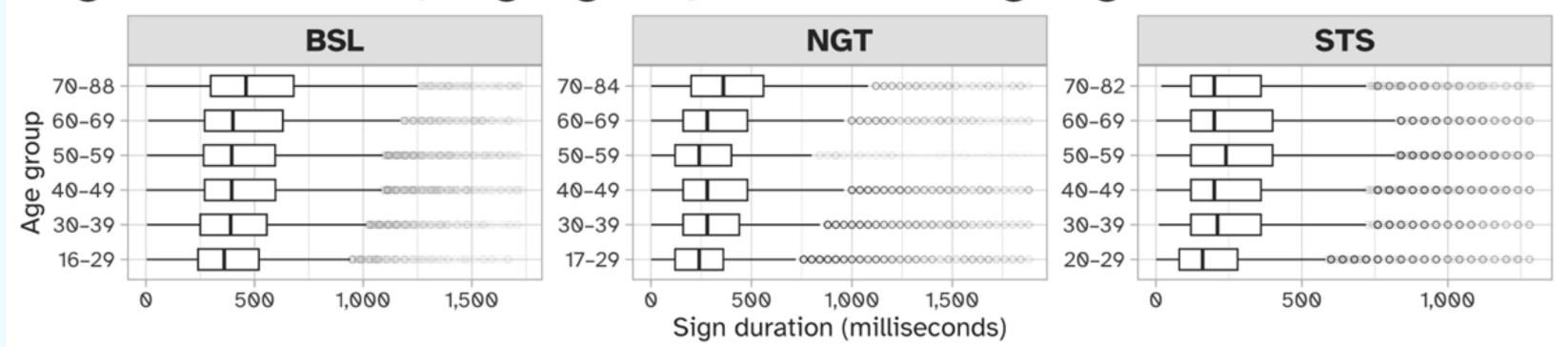


Signing rate in BSL, NGT and STS

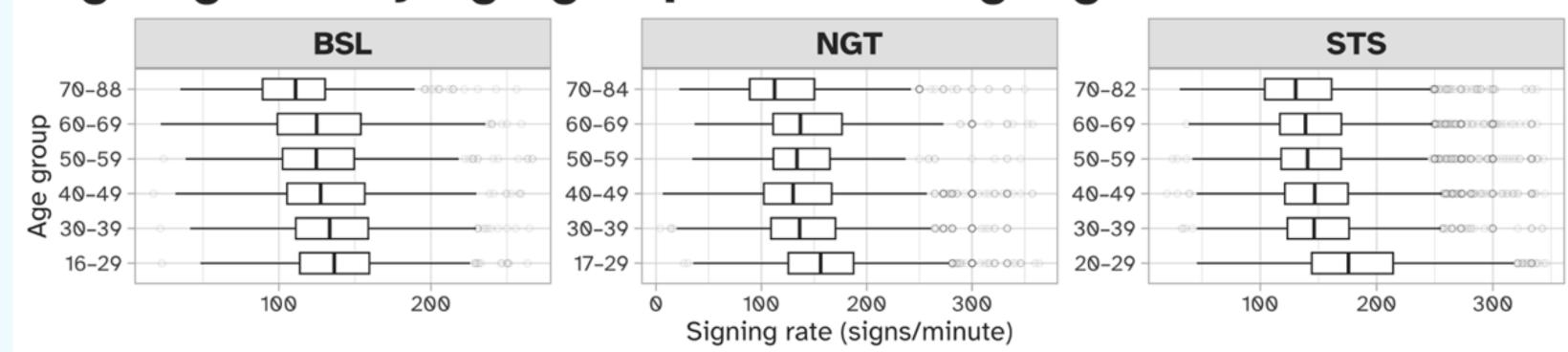
We replicated and added to this with three SL corpora:

- 1) age → duration
- 2) age → rate
- 3) no effect of gender or family

Sign duration by age group across languages



Signing rate by age group across languages



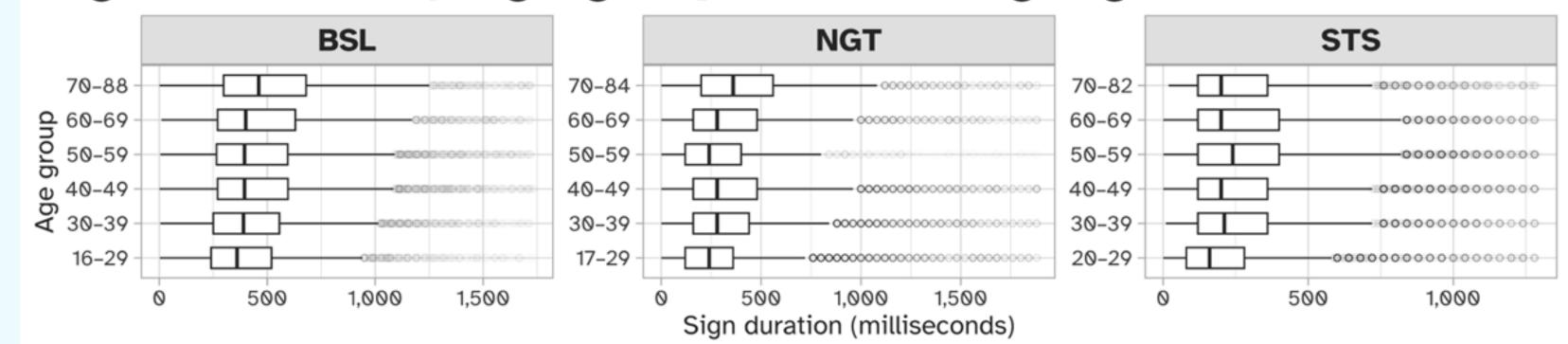
Börstell et al. (2024)

Signing rate in BSL, NGT and STS

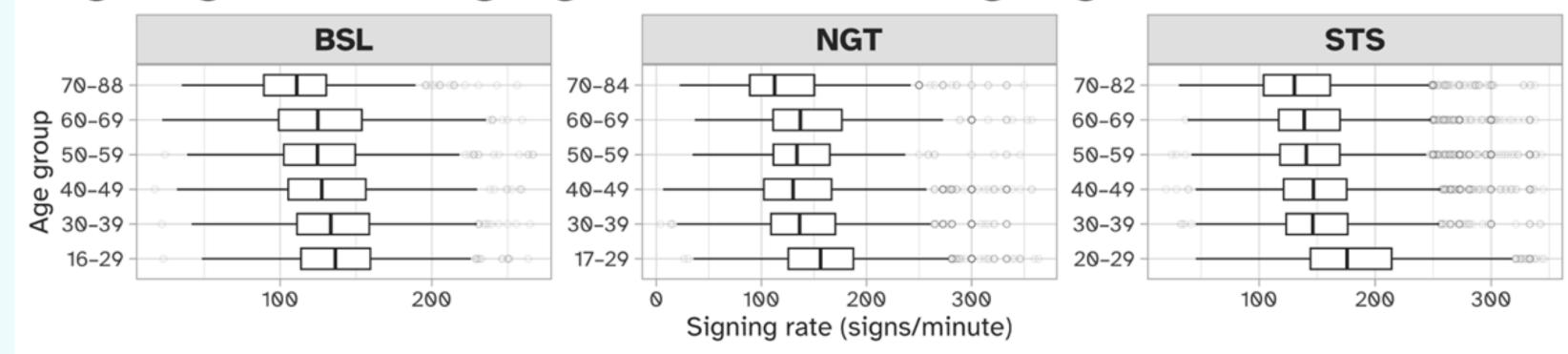
We replicated and added to this with three SL corpora:

- 1) age → duration
- 2) age → rate
- 3) no effect of gender or family
- 4) possible effect of region for BSL

Sign duration by age group across languages



Signing rate by age group across languages



Börstell et al. (2024)

Duration and rate: how

Exported (and imported) sign annotations from ELAN

Calculate duration based on timestamps (end – start)

- optional: adjust timestamps to match frame rate (fps 25 \rightarrow 40 msec)

Count number of signs divided by time (e.g., utterance)

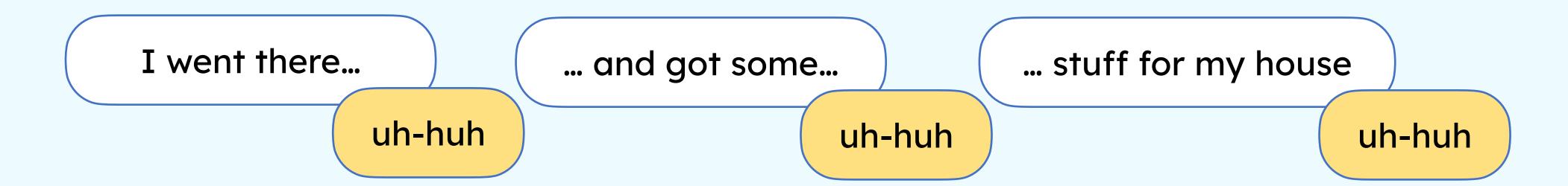
- optional: infer utterances from longer pauses (500 msec?)
- note: overlapping signs: OK; two-handed lexical signs: not OK
- note: alignment of annotations → cross-linguistic comparison?



Distributional patterns

Finding continuers (backchannels) in STS

With spoken language corpora, Dingemanse et al. (2022) developed a language-agnostic sequential search method for identifying continuers



With a few different approaches for inferring utterances and turns, I applied this sequential method to the STS Corpus data...

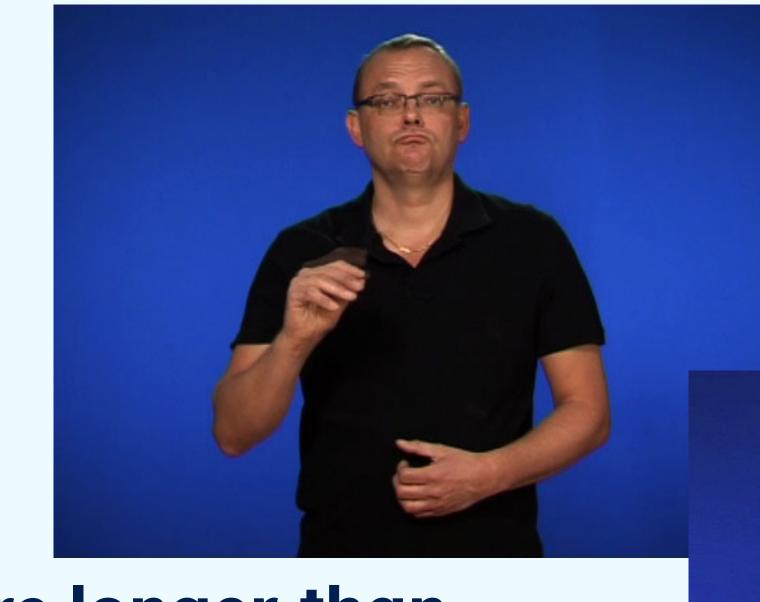
Finding continuers (backchannels) in STS

Two signs were identified as likely continuers in STS

JA@ub 'yes' (reduced)
PU@g (palms-up)

Further analysis found they are longer than expected, but also visually less obtrusive (lower and less movement in space)

Börstell (2024b); Svenskt teckenspråkslexikon (2025) https://ideophone.org/finding-continuers-across-languages-and-modalities/





Something old, something blue, something borrowed, something new...

Interactional profile

Since 2023, I've been more interested in finding ways to explore conversational and pragmatic aspects of SL corpus data quantitatively

The continuers paper and the sequential search method worked great

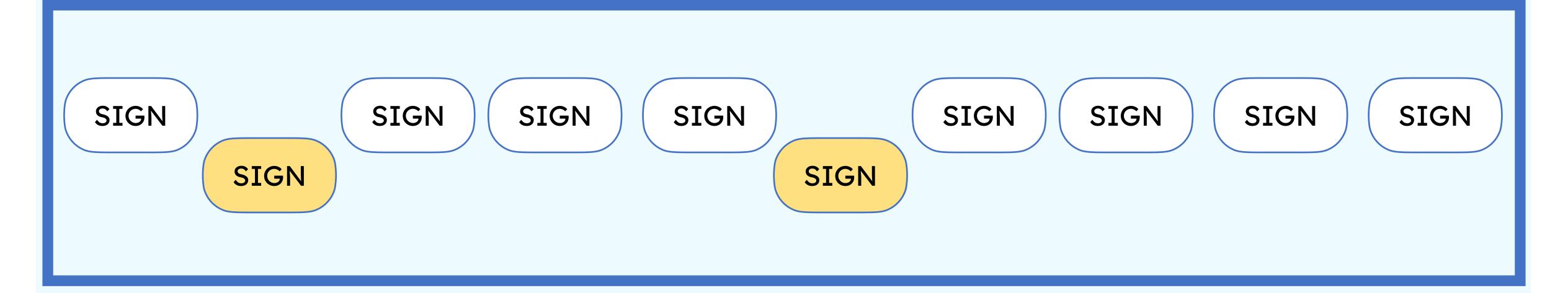
- I also employed a method looking at overlap between signers

What could be inferred from different "interactional profiles" (nomenclature?) in running text sequences of sign annotations?



Windows and steps

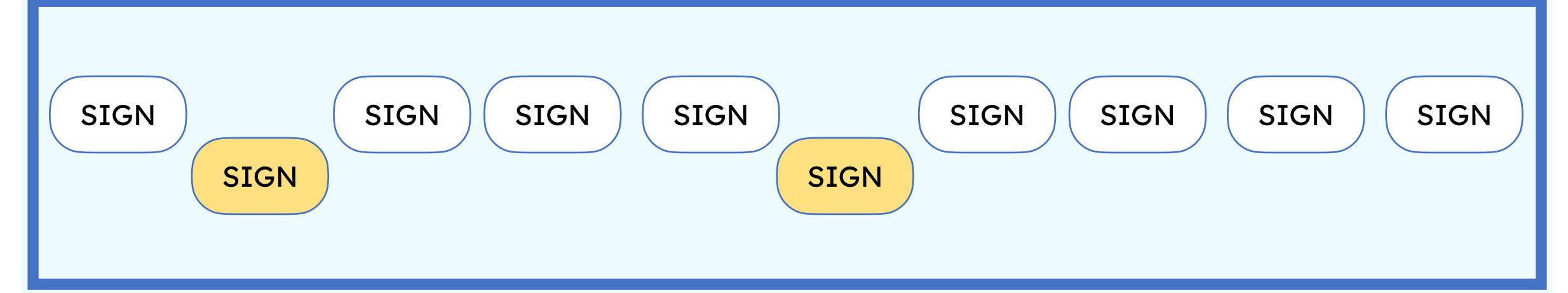
What if we look at 10 signs at a time: this is our window



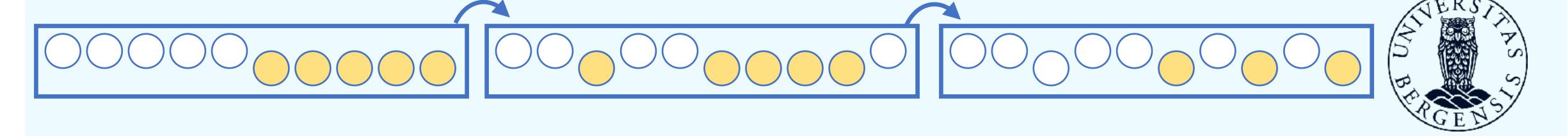


Windows and steps

What if we look at 10 signs at a time: this is our window



... we then skip to the next 10 signs (no overlap): this is our step size



Entropy is a measure of uncertainty

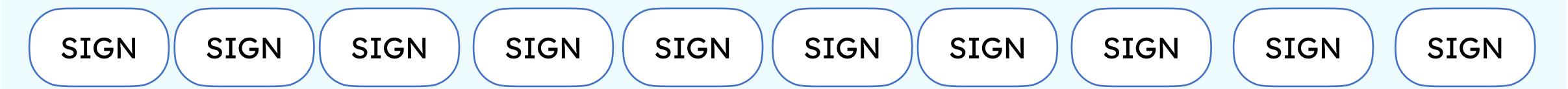
– in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?



Entropy is a measure of uncertainty

– in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?

Entropy: 0

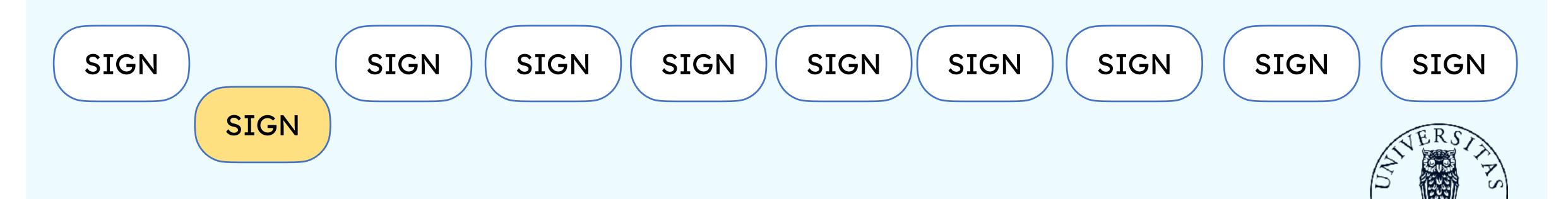




Entropy is a measure of uncertainty

– in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?

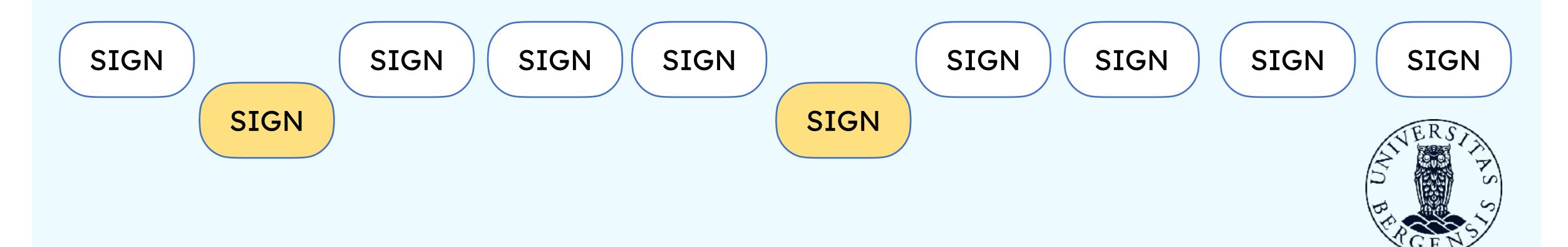
Entropy: 0.47



Entropy is a measure of uncertainty

– in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?

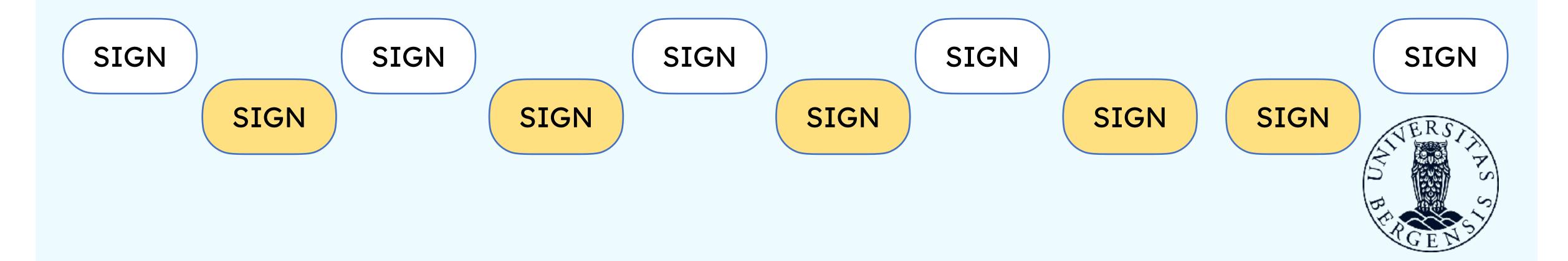
Entropy: 0.72



Entropy is a measure of uncertainty

– in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?

Entropy: 1



Entropy is a measure of uncertainty

- in any given sequence of 10 signs, we calculate signer entropy: how surprised are we by picking a specific signer from that sequence?

Entropy: 1

SIGN SIGN SIGN SIGN SIGN SIGN

Signer switches

For every window, how often does a signer switch occur

- based on time-ordered signs by start time, across both signers in a file
- 9 switches are possible within a window of 10 signs

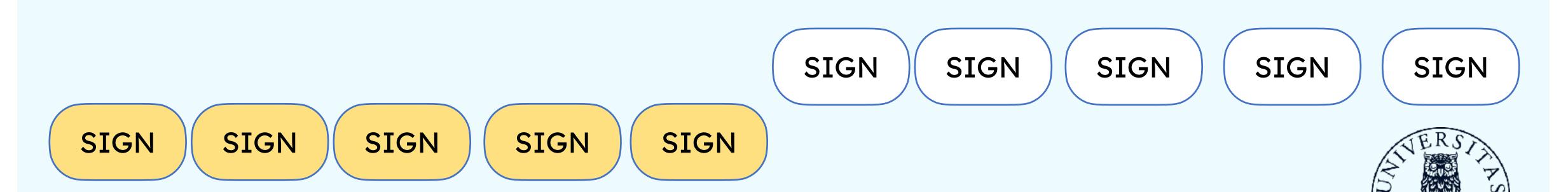


Signer switches

For every window, how often does a signer switch occur

- based on time-ordered signs by start time, across both signers in a file
- 9 switches are possible within a window of 10 signs

Switch rate: 1/9 ≈ 0.11

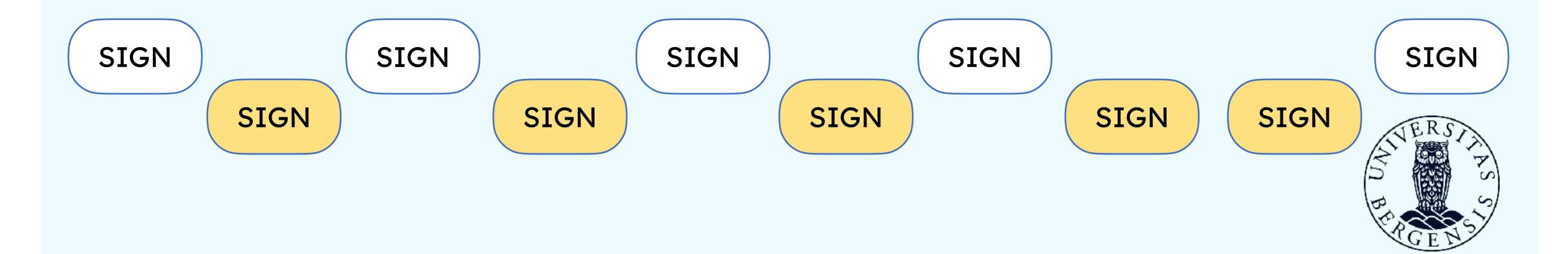


Signer switches

For every window, how often does a signer switch occur

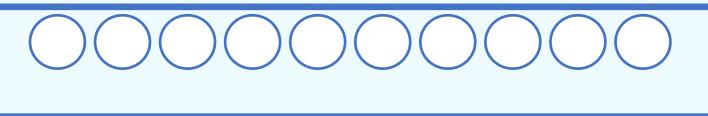
- based on time-ordered signs by start time, across both signers in a file
- 9 switches are possible within a window of 10 signs

Switch rate: 8/9 ≈ 0.89

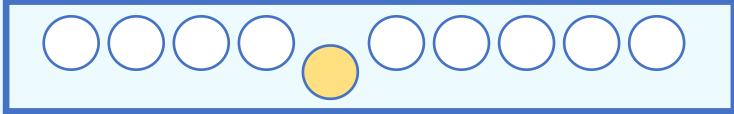


Interactional profile: hypotheses

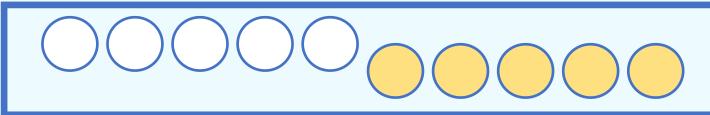
Zero entropy & Zero switch rate ≈ main signer ("monologue")



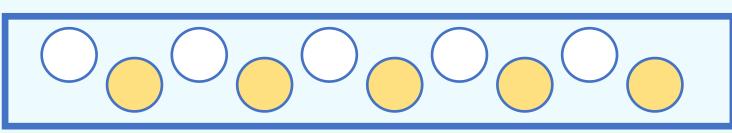
Low entropy & low switch rate ≈ insertion(s) (backchannels?)



High entropy & low switch rate ≈ signer change



High entropy & high switch rate ≈ parallel (negotiation?/repair?/TRP?)



Results: distributions

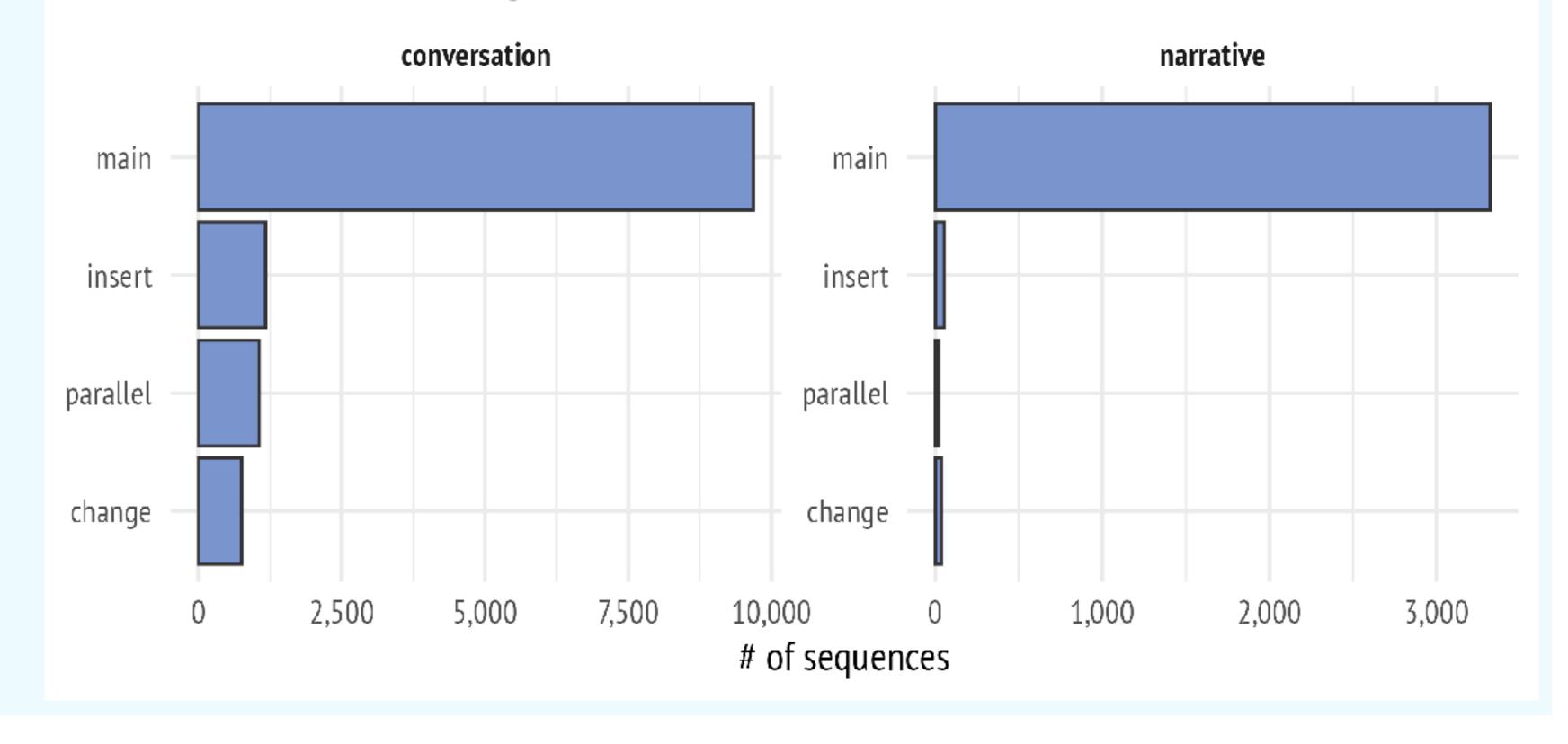
Mostly "monologue" sequences (69%)

More interactional sequences in conversation texts

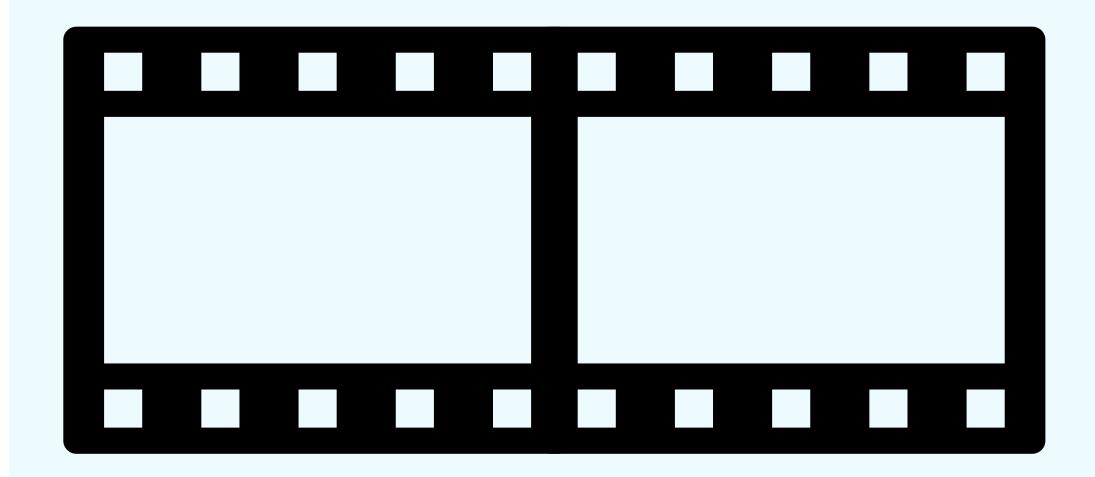
Many sequences (~15%) are N/A

Interactional profiles in STS sequences

Window size: 10 consecutive signs



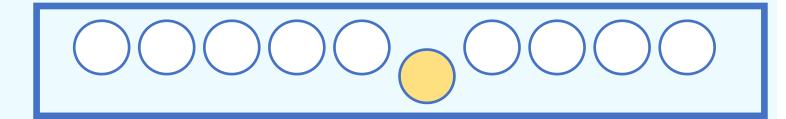
Example: insertion



https://teckensprakskorpus.su.se/video/sslc01_264.eaf?t=203070

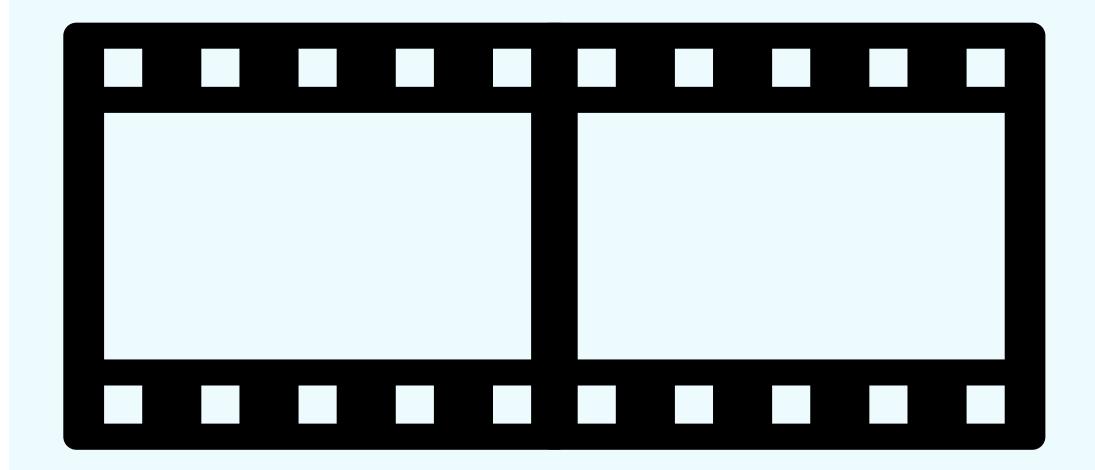
See also:

https://teckensprakskorpus.su.se/video/sslc01_322.eaf?t=193853 https://teckensprakskorpus.su.se/video/sslc01_203.eaf?t=431070





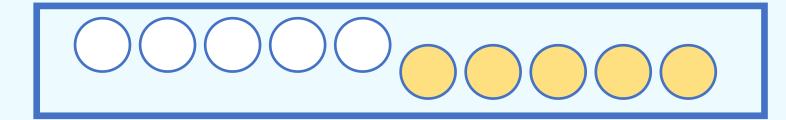
Example: change



https://teckensprakskorpus.su.se/video/sslc01_021.eaf?t=476320

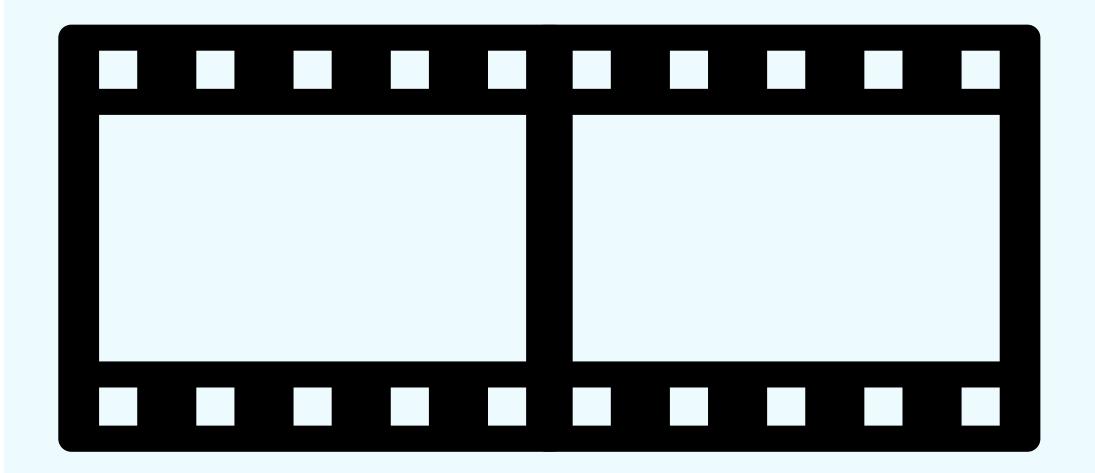
See also:

https://teckensprakskorpus.su.se/video/sslc01_307.eaf?t=228355 https://teckensprakskorpus.su.se/video/sslc01_141.eaf?t=174290





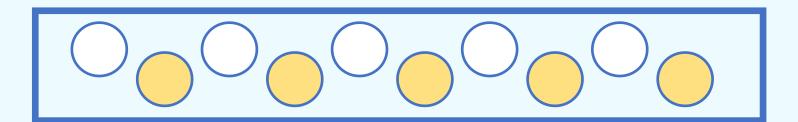
Example: parallel



https://teckensprakskorpus.su.se/video/sslc01_302.eaf?t=91580

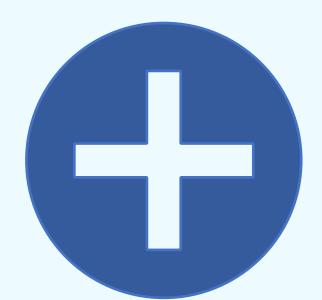
See also:

https://teckensprakskorpus.su.se/video/sslc01_244.eaf?t=289640 https://teckensprakskorpus.su.se/video/sslc01_141.eaf?t=196862





Interactional profile: goals



We could target specific places of interest within files

- may save time; quicker than visual monitoring

Interesting sequences could be looked at qualitatively in the corpus

- what is the pragmatics of different sequences?

Differences between the "interactional profiles" could be studied with regard to the signs that occur within them



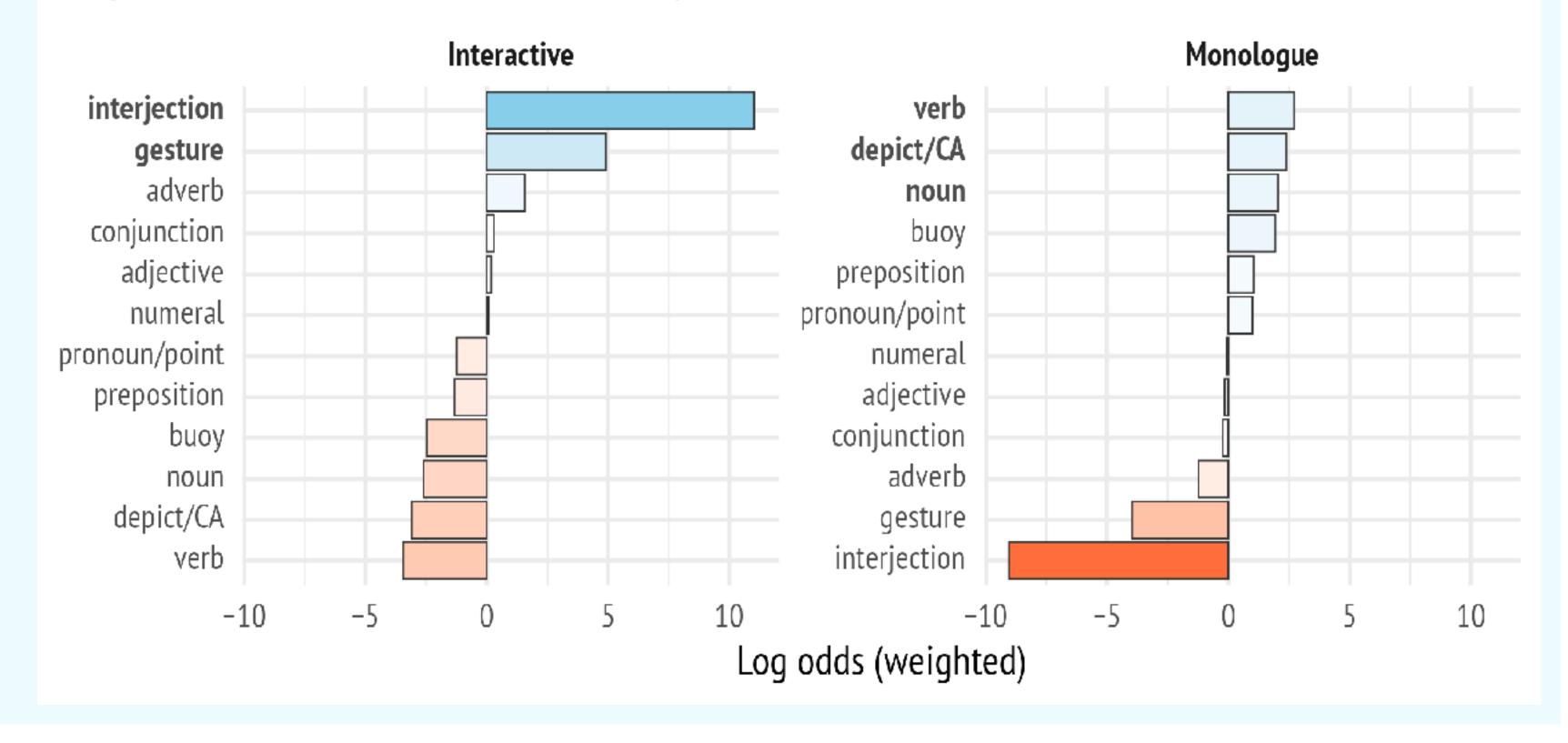
Results: preliminary

Conversation only:

The interactional profile (distribution of signing activity) is reflected in word class prevalence among the signs in conversational texts

Word class frequency by interactional profile

Only conversational texts from the STS Corpus



Results: preliminary

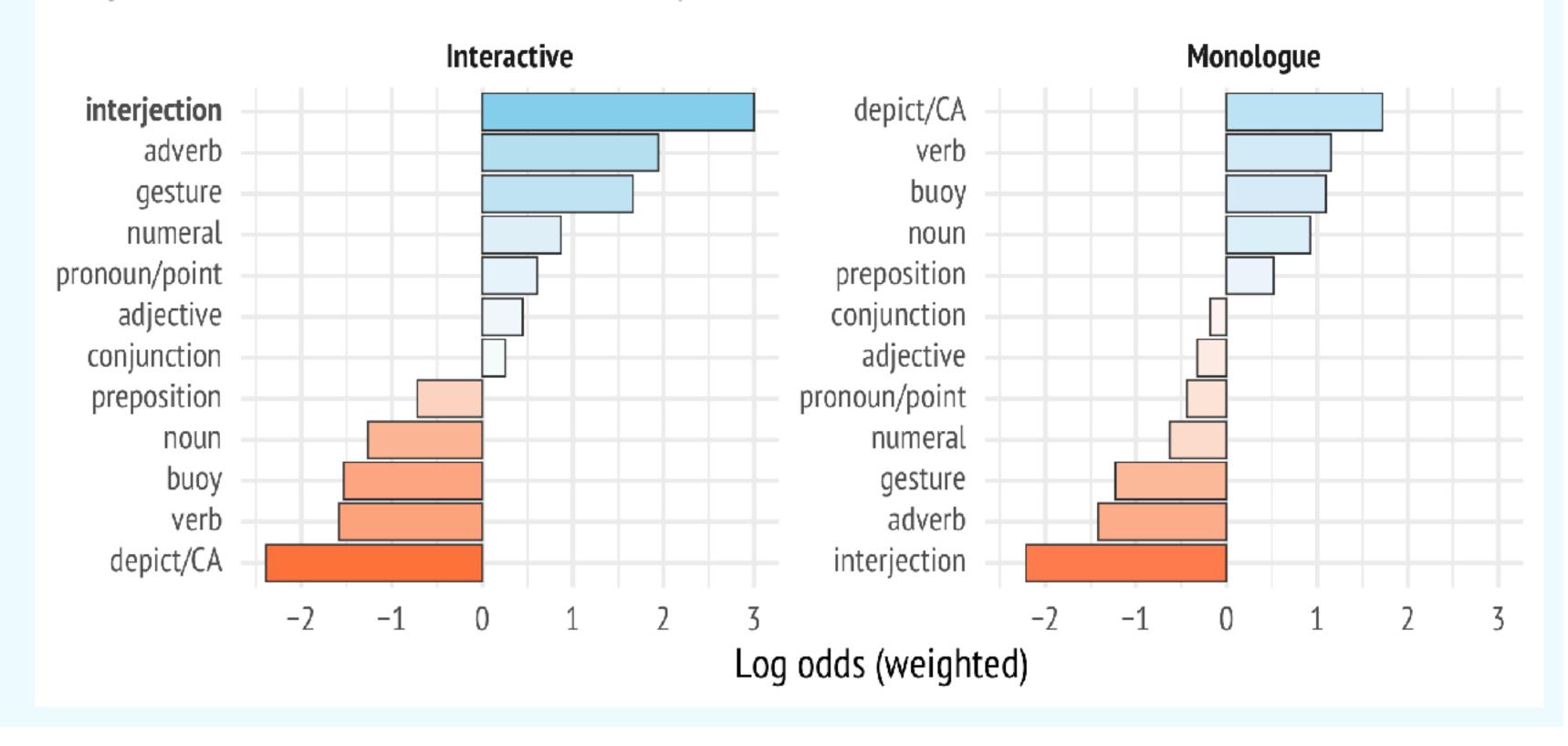
Conversation only:

The interactional profile (distribution of signing activity) is reflected in word class prevalence among the signs in conversational texts

... JA & PU removed

Word class frequency by interactional profile

Only conversational texts from the STS Corpus



Results: preliminary

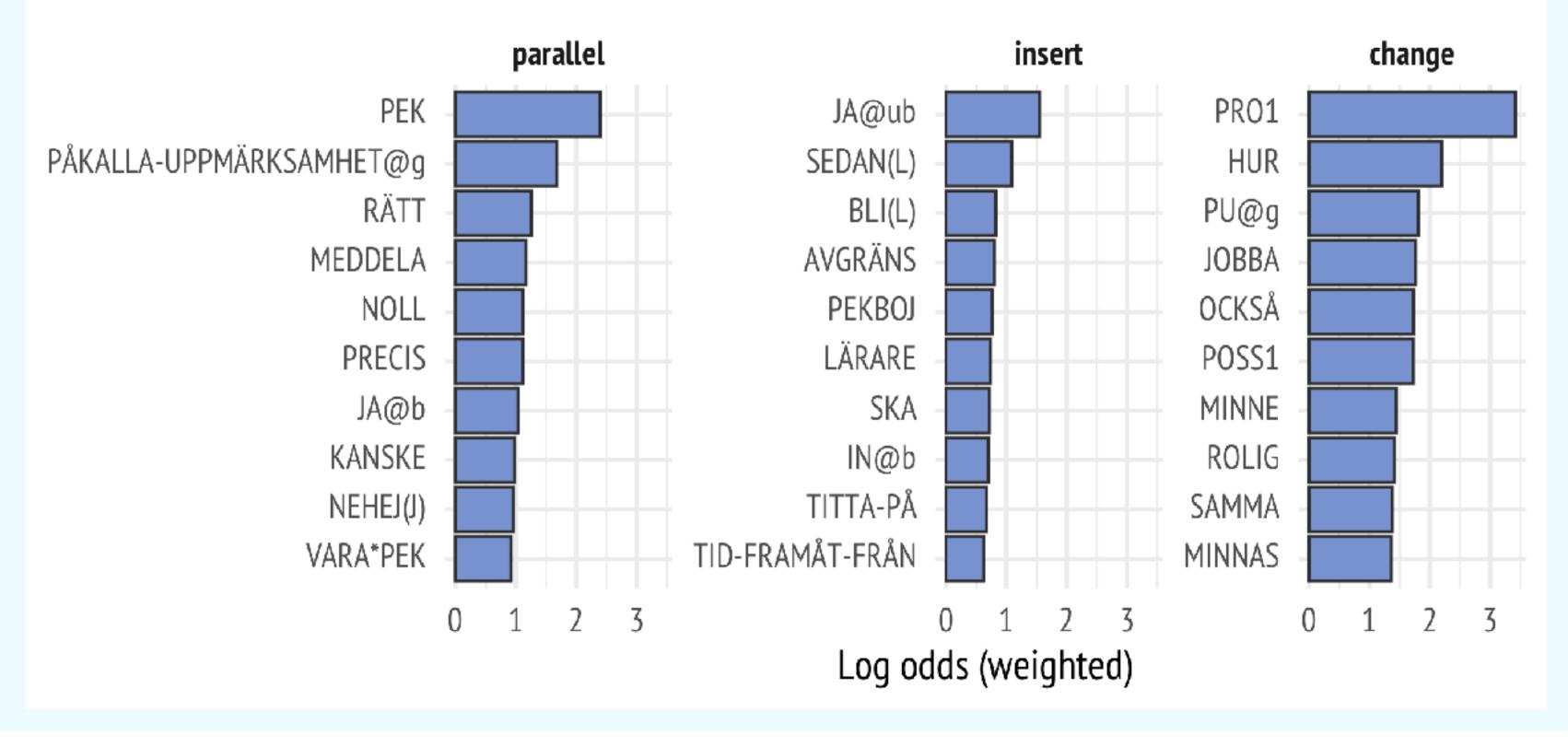
Conversation only:

Top-10 most frequent signs as distributed across the non-monologue sequences only

Some patterns, but also small dataset...

Frequent signs by interactional profile

Only conversational texts from the STS Corpus; non-monologue sequences



Feedback wanted!

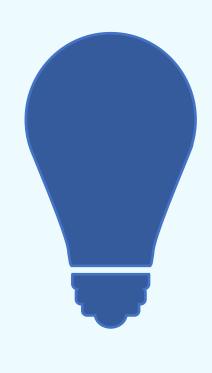
Is this the right way to go?



What are the next steps?









the WHY

Why do we use a corpus?

To explore or confirm theories, intuitions or anecdotal observations

Quantify claims that are made with little or artificial data

- allow for variation here: data is always gradient (= messy)

Use it as a source of observations: very possible

Use it as a source of data-driven distributions: still too small?



Know your data!

Using a corpus is not a substitute for looking at your data!

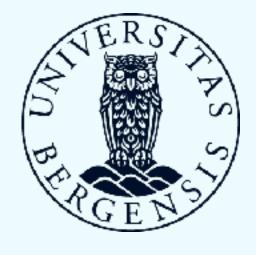


The context of occurrences is important

You need to know annotation conventions and methodological choices

- BSL corpus: longer sign annotations and split files by signer
- STS corpus: two-handed signs are not doubled

Is the corpus representative for what you want to investigate?



Where do we go from here?



There is no sociolinguistics! ≈ There is no corpus linguistics!

- compare: experimental linguistics

Corpus linguistics = methods & resources to use for Linguistics!

- assuming corpus-based rather than corpus-driven research

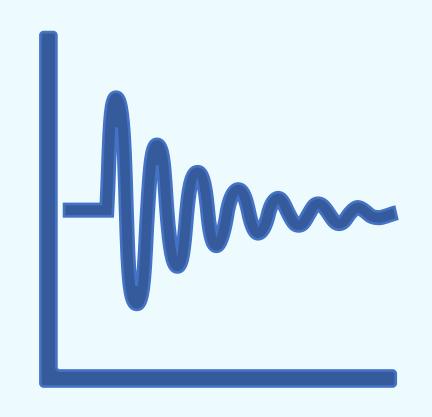
Focus on systematic enhancement, not expansion of "superficial" data

- or, maybe: ¿por qué no los dos? ('why not both?')

Computer vision?

Is computer vision the future for sign language corpora?

Maybe?



My view is:

- it can help enhance current corpora with little time and effort
- it can capture some phonetic details (but: errors!)
- it cannot replace human annotation/correction



Feedback on the "interactional profiles", please!

References

- Aijmer, Karin. 2018. Corpus pragmatics: From form to function. In Andreas H. Jucker, Klaus P. Schneider & Wolfram Bublitz (eds.), Methods in Pragmatics, 555–586. De Gruyter. https://doi.org/10.1515/9783110424928-022.
- Biber, Douglas, Susan Conrad & Randi Reppen. 1998. Corpus linguistics: investigating language structure and use (Cambridge Approaches to Linguistics). Cambridge; New York: Cambridge University Press.
- Börstell, Carl. 2022. Searching and Utilizing Corpora. In Jordan Fenlon & Julie A. Hochgesang (eds.), Signed Language Corpora (Sociolinguistics in Deaf Communities 25), 90–127. Washington, DC: Gallaudet University Press.
- Börstell, Carl. 2024a. How to Approach Lexical Variation in Sign Language Corpora. In Eleni Efthimiou, Stavroula-Evita Fotinea, Thomas Hanke, Julie A. Hochgesang, Johanna Mesch & Marc Schulder (eds.), Proceedings of the LREC-COLING 2024 11th Workshop on the Representation and Processing of Sign Languages: Evaluation of Sign Language Resources, 222–229. Torino, Italy: ELRA Language Resources Association (ELRA) and the International Committee on Computational Linguistics (ICCL). https://www.sign-lang.uni-hamburg.de/lrec/pub/24026.pdf.
- Börstell, Carl. 2024b. Finding continuers in Swedish Sign Language. Linguistics Vanguard. https://doi.org/10.1515/lingvan-2024-0025.
- Börstell, Carl, Thomas Hörberg & Robert Östling. 2016. Distribution and duration of signs and parts of speech in Swedish Sign Language. Sign Language & Linguistics 19(2). 143–196. https://doi.org/10.1075/sll.19.2.01bor.
- Börstell, Carl, Adam Schembri & Onno Crasborn. 2024. Sign duration and signing rate in British Sign Language, Dutch Sign Language and Swedish Sign Language. Glossa Psycholinguistics 3(1). https://doi.org/10.5070/G60111915.
- Börstell, Carl & Robert Östling. 2016. Visualizing Lects in a Sign Language Corpus: Mining Lexical Variation Data in Lects of Swedish Sign Language. In Eleni Efthimiou, Stavroula-Evita Fotinea, Thomas Hanke, Julie A. Hochgesang, Jette Kristoffersen & Johanna Mesch (eds.), Proceedings of the LREC2016 7th Workshop on the Representation and Processing of Sign Languages: Corpus Mining, 13–18. Portorož, Slovenia: European Language Resources Association (ELRA). https://www.sign-lang.uni-hamburg.de/lrec/pub/16004.pdf.
- Crasborn, Onno. 2015. Transcription and Notation Methods. In Eleni Orfanidou, Bencie Woll & Gary Morgan (eds.), Research Methods in Sign Language Studies, 74–88. Chichester: John Wiley & Sons, Ltd. https://doi.org/10.1002/9781118346013.ch5.

References

- Dingemanse, Mark, Andreas Liesenfeld & Marieke Woensdregt. 2022. Convergent Cultural Evolution of Continuers (mhmm). In Andrea Ravignani, Rie Asano, Daria Valente, Francesco Ferretti, Stefan Hartmann, Misato Hayashi, Yannick Jadoul, et al. (eds.), Proceedings of the Joint Conference on Language Evolution (JCoLE), 160–167. Kanazawa, Japan. https://doi.org/10.17617/2.3398549.
- Fenlon, Jordan & Julie A. Hochgesang (eds.). 2022. Signed Language Corpora (Sociolinguistics in Deaf Communities 25). Washington, DC: Gallaudet University Press. https://doi.org/10.2307/j.ctv2rcnfhc.
- Fenlon, Jordan, Adam Schembri, Ramas Rentelis, David Vinson & Kearsy Cormier. 2014. Using conversational data to determine lexical frequency in British Sign Language: The influence of text type. Lingua 143. 187–202. https://doi.org/10.1016/j.lingua.2014.02.003.
- Johnston, Trevor. 2010. From archive to corpus: Transcription and annotation in the creation of signed language corpora. International Journal of Corpus Linguistics 15(1). 106–131. https://doi.org/10.1075/ijcl.15.1.05joh.
- Johnston, Trevor. 2012. Lexical frequency in sign languages. Journal of Deaf Studies and Deaf Education 17(2). 163–193. https://doi.org/10.1093/deafed/enr036.
- Johnston, Trevor. 2014. The reluctant oracle: Adding value to, and extracting of value from, a signed language corpus through strategic annotations. Corpora 9(2). 155–189. https://doi.org/10.3366/cor.2014.0056.
- Joseph, Brian D. 2008. The Editor's Department: Last scene of all . . . Language 84(4). 686–690. https://doi.org/10.1353/lan.0.0063.
- Kennedy, Graeme D. 2014. An Introduction to Corpus Linguistics (Studies in Language and Linguistics). Hoboken: Taylor and Francis.
- Kimchi, Inbal, Lucie Wolters, Rose Stamp & Inbal Arnon. 2023. Evidence of Zipfian distributions in three sign languages. Gesture 22(2). 154–188. https://doi.org/10.1075/gest.23014.kim.
- Kopf, Maria, Marc Schulder & Thomas Hanke. 2022. The Sign Language Dataset Compendium: Creating an Overview of Digital Linguistic Resources. In Proceedings of the LREC2022 10th Workshop on the Representation and Processing of Sign Languages: Multilingual Sign Language Resources, 102–109. Marseille, France: European Language Resources Association. https://aclanthology.org/2022.signlang-1.16.
- Kortmann, Bernd. 2021. Reflecting on the quantitative turn in linguistics. Linguistics 59(5). 1207–1226. https://doi.org/10.1515/ling-2019-0046.
- McEnery, Tony & Andrew Hardie. 2011. Corpus Linguistics: Method, Theory and Practice. 1st edn. Cambridge University Press. https://doi.org/10.1017/CBO9780511981395.

References

- McKee, David & Graeme Kennedy. 2006. The distribution of signs in New Zealand Sign Language. Sign Language Studies 6(4). 372–391. https://doi.org/10.1353/sls.2006.0027.
- Mesch, Johanna, Lars Wallin, Anna-Lena Nilsson & Brita Bergman. 2012. Dataset. Swedish Sign Language Corpus project 2009–2011 (version 1). Sign Language Section, Department of Linguistics, Stockholm University. https://teckensprakskorpus.su.se.
- Morford, Jill P. & James MacFarlane. 2003. Frequency characteristics of American Sign Language. Sign Language Studies 3(2). 213–226. https://doi.org/10.1353/sls.2003.0003.
- O'Keeffe, Anne. 2018. Corpus-based function-to-form approaches. In Andreas H. Jucker, Klaus P. Schneider & Wolfram Bublitz (eds.), Methods in Pragmatics, 587–618. De Gruyter. https://doi.org/10.1515/9783110424928-023.
- Öqvist, Zrajm, Nikolaus Riemer Kankkonen & Johanna Mesch. 2020. STS-korpus: A Sign Language Web Corpus Tool for Teaching and Public Use. In Eleni Efthimiou, Stavroula-Evita Fotinea, Thomas Hanke, Julie A. Hochgesang, Jette Kristoffersen & Johanna Mesch (eds.), Proceedings of the LREC2020 9th Workshop on the Representation and Processing of Sign Languages: Sign Language Resources in the Service of the Language Community, Technological Challenges and Application Perspectives, 177–180. Marseille, France: European Language Resources Association (ELRA). https://www.sign-lang.uni-hamburg.de/lrec/pub/20014.pdf.
- Östling, Robert, Carl Börstell, Moa Gärdenfors & Mats Wirén. 2017. Universal Dependencies for Swedish Sign Language. In Jörg Tiedemann & Nina Tahmasebi (eds.), Proceedings of the 21st Nordic Conference on Computational Linguistics, 303–308. Gothenburg, Sweden: Association for Computational Linguistics. https://aclanthology.org/W17-0243.
- Östling, Robert, Carl Börstell & Lars Wallin. 2015. Enriching the Swedish Sign Language Corpus with Part of Speech Tags Using Joint Bayesian Word Alignment and Annotation Transfer. In Proceedings of the 20th Nordic Conference of Computational Linguistics (NoDaLiDa 2015), 263–268. Vilnius, Lithuania: Linköping University Electronic Press, Sweden. https://aclanthology.org/W15-1834.
- Stamp, Rose, Adam Schembri, Jordan Fenlon, Ramas Rentelis, Bencie Woll & Kearsy Cormier. 2014. Lexical variation and change in British Sign Language. PLoS ONE 9(4). https://doi.org/10.1371/journal.pone.0094053.
- Tognini-Bonelli, Elena. 2001. Corpus linguistics at work (Studies in Corpus Linguistics volume 6). Amsterdam Philadelphia: John Benjamins Publishing Company. https://doi.org/10.1075/scl.6.
- Zipf, George K. 1935. The psycho-biology of language: An introduction to dynamic philology. New York, NY: Houghton Mifflin.
- Zipf, George Kingsley. 1949. Human behavior and the principle of least effort: An introduction to human ecology. Cambridge, MA: Addison-Wesley.

Thank you!
Kiitos paljon!
Tusen takk!
Tack så mycket!