# Analysis of Subject-Object-Verb Word Order Patterns in Slovenian Spoken and Written Corpora

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#### Introduction

This project analyzes Slovenian word order using Universal Dependencies (UD) and the World Atlas of Linguistic Structures (WALS).

- Universal Dependencies (UD): A framework for annotating syntactic relations to analyze sentence structure across languages.
- World Atlas of Linguistic Structures (WALS): A database providing typological information, including common word order patterns for cross-linguistic comparison.

**Main goal:** To explore linguistic patterns, focusing on the subject-verb-object (SVO) structure in Slovenian.

The project integrates linguistic theory with computational methods for analysis.

#### Introduction 2: UD

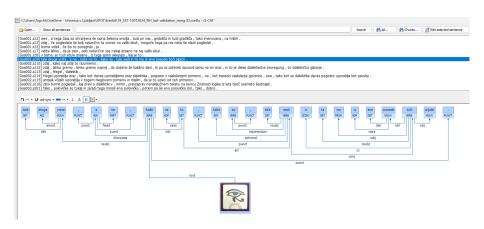


Figure: Example of UD annotated sentence in Q-CAT

#### Introduction 3: WALS

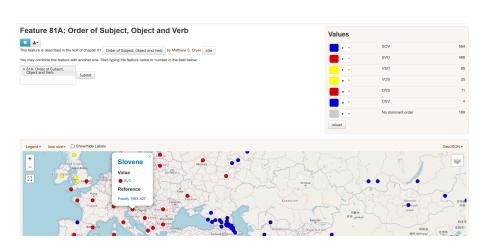


Figure: Example of WALS feature

## Research Questions and Hypotheses

- RQ1: To what extent do spoken Slovenian word order patterns align with WALS typological features?
  - **H1:** Spoken Slovenian will deviate from WALS word order typologies, as WALS predominantly reflects written language norms, whereas spoken Slovenian exhibits greater variability in Subject-Verb-Object arrangements.
- RQ2: Are there significant differences in word order patterns between spoken and written Slovenian in relation to WALS typological features? H2: Spoken Slovenian will display greater variability in Subject-Object-Verb word order patterns compared to written Slovenian, which adheres more closely to WALS's SVO classification.
- **RQ3:** Do WALS's binary categories adequately capture the word order nuances found in spoken Slovenian?
  - **H3:** WALS's binary classification of word order fails to capture the full range of Subject-Object-Verb patterns in spoken Slovenian, which frequently includes marked orders (e.g., OSV, OVS) driven by pragmatic and contextual factors.

#### Feature Table

In the first phase, I extracted linguistic features from the WALS database, focusing on those relevant to Slovenian, with Word Order having the most representation.

Initially focused on Slovenian, the table was later expanded to include features from all languages in WALS.

This work also contributed to the development of LLMs in Slovenia, simplifying UD queries for researchers and the public.

#### The final feature table and interactive app are available here:

- Feature Table
- Interactive Feature App
- App Demo Video

#### Feature Extraction

A major challenge was extracting feature data from the WALS database. Web scraping was difficult due to dynamic JavaScript elements, so I manually copied and formatted the data into a '.txt' file. Initially focused on Slovenian, I later expanded the table to include features from all languages in WALS for broader comparisons. The final table contains 192 features, with 43 (22.4%) relevant to Slovenian.

#### Feature Distribution for Slovenian

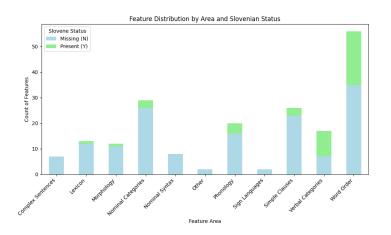


Figure: Distribution of WALS features in Slovenian

Strong representation in Word Order and Verbal Categories, minimal presence in other categories.

## Slovenian Word Order: Written vs. Spoken Language

While WALS classifies languages by typology, it doesn't fully capture variations within languages, like those in Slovenian. Slovenian shows flexible word order, especially in spoken language, where variability often leads to No Dominant Order (NDO), unlike the fixed SVO pattern in written language.

## Analysis of WALS Feature 81A

I focused on analyzing WALS Feature 81A: Order of Subject, Object and Verb, which identifies the order of subject, object, and verb in basic declarative clauses. To explore this in Slovenian, I used two pre-annotated corpora (SST, SSJ) and cleaned up punctuation in SSJ to ensure comparability with SST.

STARK was employed to extract dependency trees, but challenges appeared when handling indirect relations between words. These required more complex processing to accurately capture the syntactic structure.

#### STARK Tool 1

.codegpt	7. 01. 2025 19:44	File folder	
.git		File folder	
logos logos		File folder	
sample		File folder	
scripts		File folder	
scripts_n		File folder	
stark		File folder	
tests tests		File folder	
gitignore	7. 01. 2025 19:44	Git Ignore Source File	
advanced.md		Markdown Source File	
🖟 config.ini	15. 01. 2025 12:19	Configuration settings	
install.bat		Windows Batch File	
☐ LICENSE.txt		Text Document	
MANIFEST.in			
README.md		Markdown Source File	
requirements.txt		Text Document	
™ run.bat		Windows Batch File	
run.sh		sh_auto_file	
settings.md		Markdown Source File	
setup.py		Python Source File	
stark.py		Python Source File	
stark-multiresult.py		Python Source File	

Figure: Files of STARK tool

#### STARK Tool 2

```
GENERAL SETTINGS
input = sample/wals/input/sl_sst-ud-merged.conllu
output = sample/wals/output/sst patterns NOVO.tsv
;__TREE SPECIFICATIONS
node_type = form
labeled = yes
label subtypes = yes
fixed = yes
;__TREE RESTRICTIONS__
size = 2-10000
;head = upos=VERB upos=NOUN
ignored labels = punct|reparandum
;allowed labels = nsubj|obj|obl
;___SEARCH BY QUERY_
query = upos=VERB >nsubj >obj iobj
node info = yes
association measures = no
;compare = sample/fr gsd-ud-dev.conllu
;__VISUALISATION
example = yes
grew_match = yes
depsearch = no
  OUTPUT THRESHOLD
:frequency threshold = 5
;max lines = 100
; ******* ADVANCED SETTINGS (see advanced.md) *********
:internal saves = ./internal saves
:cpu cores = 12
;continuation processing = no
greedy_counter = yes
complete = no
;processing size = 1-7
:sentence count file = number of matched trees per sentence.txt
detailed results file = list of all sentences with matched trees.txt
```

Figure: Example of STARK configuration

## STARK Output

Tree	Node A	-fo Node B-	fo Node C-fo Nu	ımber o Head nod	Example
kaj <obj <nsubj="" jaz="" td="" vem<=""><td>kaj</td><td>jaz</td><td>vem</td><td>3 vem</td><td>in pač ne vem zdaj kaj ali imeli svoj lasten piknik ali A[kaj] B[jaz] C[vem]</td></obj>	kaj	jaz	vem	3 vem	in pač ne vem zdaj kaj ali imeli svoj lasten piknik ali A[kaj] B[jaz] C[vem]
kaj <obj <nsubj="" pomeni<="" td="" to=""><td>kaj</td><td>to</td><td>pomeni</td><td>3 pomeni</td><td>kaj A[kaj] zdaj B[to] C[pomeni]</td></obj>	kaj	to	pomeni	3 pomeni	kaj A[kaj] zdaj B[to] C[pomeni]
mi <obj je="">nsubj poklic</obj>	mi	je	poklic	3 je	in pravzaprav A[mi] B[je] zato moj C[poklic] všeč
to <nsubj <obj="" mi="" td="" zdi<=""><td>to</td><td>mi</td><td>zdi</td><td>3 zdi</td><td>in A(to) se B(mi) C(zdi) neki tak proces učenja e kaj se je pa zdaj zgodilo v</td></nsubj>	to	mi	zdi	3 zdi	in A(to) se B(mi) C(zdi) neki tak proces učenja e kaj se je pa zdaj zgodilo v
aktiv <nsubj dobi="">obj rezultat</nsubj>	aktiv	dobi	rezultat	3 dobi	ker osmi šesti tukaj piše A[aktiv] B[dobi] skupni C[rezultat] vseh
jaz <nsubj <obj="" ga="" spomnim<="" td=""><td>jaz</td><td>ga</td><td>spomnim</td><td>3 spomnim</td><td>A[jaz] se B[ga] ne C[spomnim]</td></nsubj>	jaz	ga	spomnim	3 spomnim	A[jaz] se B[ga] ne C[spomnim]
kaj <obj <nsubj="" govoriš<="" td="" ti=""><td>kaj</td><td>ti</td><td>govoriš</td><td>3 govoriš</td><td>a no daj veš kdo bo šel na dvoboj A[kaj] B[ti] meni zdaj C[govoriš]</td></obj>	kaj	ti	govoriš	3 govoriš	a no daj veš kdo bo šel na dvoboj A[kaj] B[ti] meni zdaj C[govoriš]
kaj <obj <nsubj="" pravite<="" td="" vi=""><td>kaj</td><td>vi</td><td>pravite</td><td>3 pravite</td><td>mhm kaj pa vi pravite na to gos- ja k- A[kaj] B[vi] C[pravite] gospo-</td></obj>	kaj	vi	pravite	3 pravite	mhm kaj pa vi pravite na to gos- ja k- A[kaj] B[vi] C[pravite] gospo-
kar <nsubj <obj="" mi="" td="" zdi<=""><td>kar</td><td>mi</td><td>zdi</td><td>3 zdi</td><td>zdaj mi se srečujemo tulele s predlogi vlade ne ker prinese izračune na d</td></nsubj>	kar	mi	zdi	3 zdi	zdaj mi se srečujemo tulele s predlogi vlade ne ker prinese izračune na d
kar <nsubj <obj="" td="" tega="" tiče<=""><td>kar</td><td>tega</td><td>tiče</td><td>3 tiče</td><td>ja eee ker svet ni več tako zelo prijazen vsaj A[kar] se B[tega] C[tiče]</td></nsubj>	kar	tega	tiče	3 tiče	ja eee ker svet ni več tako zelo prijazen vsaj A[kar] se B[tega] C[tiče]
kdo <nsubj <obj="" ga="" td="" zagleda<=""><td>kdo</td><td>ga</td><td>zagleda</td><td>3 zagleda</td><td>A[kdo] B[ga] od daleč že C[zagleda] [name:personal] prosim</td></nsubj>	kdo	ga	zagleda	3 zagleda	A[kdo] B[ga] od daleč že C[zagleda] [name:personal] prosim
kraj <nsubj <obj="" je<="" td="" vam=""><td>kraj</td><td>vam</td><td>je</td><td>3 je</td><td>e kateri izletniški A[kraj] B[vam] C[je] všeč in zakaj</td></nsubj>	kraj	vam	je	3 je	e kateri izletniški A[kraj] B[vam] C[je] všeč in zakaj
mi <nsubj <obj="" predlagali<="" td="" tega=""><td>mi</td><td>tega</td><td>predlagali</td><td>3 predlagal</td><td>A[mi] B[tega] nismo C[predlagali]</td></nsubj>	mi	tega	predlagali	3 predlagal	A[mi] B[tega] nismo C[predlagali]
mi <obj bil="">nsubj film</obj>	mi	bil	film	3 bil	najbolj všeč A[mi] je B[bil] C[film] e Hitri in drzni drugi del zaradi tega ker

Figure: STARK output

Search query: query = upos=VERB >nsubj > obj|iobj

## Data Cleaning and Processing

After extracting the relevant data, I used Python to clean it by removing unnecessary columns, assigning correct word order patterns, and merging data from both corpora. A key challenge was tagging parts of speech (POS), which was resolved after adjustments. I also attempted to automate sentence extraction but reverted to the original method for better results.

#### **CONLLU File**

```
# text = ravno danes sva se slišali, je rekla, da imata ob pol dvanajstih vaje, tako da vaje imajo normalno, ne.
# sent_id = iriss.942
                          Q _ 2 advmod _ seg_id=Artur-N-G5020-P600012.s36|tei_tok_id=Artur-N-G5020-P600012.t
   ravno
           ravno
                   ADV Rgp Degree=Pos 5 advmod seg id=Artur-N-G5020-P600012.s36|tei tok id=Artur-N-G5020-P60001
   danes
                              Mood=Ind|Number=Dual|Person=1|Polarity=Pos|Tense=Pres|VerbForm=Fin 5 aux _ seg_id=
               AUX Va-r1d-n
                   Px-----v PronType=Prs Reflex=Yes Variant=Short 5 expl seg id=Artur-N-G5020-P600012.s3
                          Vmbp-df Gender=Masc | Number=Dual | VerbForm=Part 0 root _
   slišali slišati VERB
                                                                                         seg id=Artur-N-G5020-P60001
           PUNCT
                          8 punct
                                          seg id=Artur-N-G5020-P600012.s36 tei tok id=Artur-N-G5020-P600012.tok247
                              Mood=Ind|Number=Sing|Person=3|Polarity=Pos|Tense=Pres|VerbForm=Fin 8 aux _
   ie biti
               AUX Va-r3s-n
                          Vmep-sf Aspect=Perf|Gender=Fem|Number=Sing|VerbForm=Part 5 parataxis
           reči
           PUNCT
                          11 punct
                                          seg_id=Artur-N-G5020-P600012.s37|tei_tok_id=Artur-N-G5020-P600012.tok250
                                          seg id=Artur-N-G5020-P600012.s37|tei tok id=Artur-N-G5020-P600012.tok251
           SCONJ
                          11 mark
           imeti
                   VERB
                           Vmpr3d-n
                                      Aspect=Imp|Mood=Ind|Number=Dual|Person=3|Polarity=Pos|Tense=Pres|VerbForm=Fin
   imata
                   Case=Loc
                              14 case
                                              seg id=Artur-N-G5020-P600012.s37 tei tok id=Artur-N-G5020-P600012.tok25
                                                  seg_id=Artur-N-G5020-P600012.s37|tei_tok_id=Artur-N-G5020-P600012.t
   pol pol DET Rgp PronType=Ind
   dvanajstih dvanajst
                                     Case=Loc|Number=Plur|NumForm=Word|NumType=Card 11 obl seg id=Artur-N-G502
                          Ncfpg Case=Gen|Gender=Fem|Number=Plur 11 obj seg_id=Artur-N-G5020-P600012.s37|SpaceAf
   vaje
           vaje
           PUNCT
                                          seg id=Artur-N-G5020-P600012.s37|tei tok id=Artur-N-G5020-P600012.tok257
                                  20 cc seg id=Artur-N-G5020-P600012.s38|tei tok id=Artur-N-G5020-P600012.tok258
   tako
           tako
                   CCONJ
                                          seg id=Artur-N-G5020-P600012.s38|tei tok id=Artur-N-G5020-P600012.tok259
   da da
                          Ncfpn Case=Nom|Gender=Fem|Number=Plur 20 obj seg id=Artur-N-G5020-P600012.s38|tei tok
                   NOUN
   vaje
           vaja
                   VERB
                                      Aspect=Imp | Mood=Ind | Number=Plur | Person=3 | Polarity=Pos | Tense=Pres | VerbForm=Fin
   imajo
           imeti
                          Vmpr3p-n
               normalno
                          ADV Rgp Degree=Pos 20 advmod seg id=Artur-N-G5020-P600012.s38|SpaceAfter=No|tei tok
   normalno
           PUNCT
                          23 punct
                                          seg id=Artur-N-G5020-P600012.s38|tei tok id=Artur-N-G5020-P600012.tok263
           PART
                       Polarity=Neg
                                      20 discourse seg id=Artur-N-G5020-P600012.s38|SpaceAfter=No|tei tok id=A
                                          sentence ending=True|seg id=Artur-N-G5020-P600012.s38|tei tok id=Artur-N-G50
           PUNCT
                           5 punct
```

Figure: Example of CONLLU file

## Statistical Analysis

**Summary:** Statistical analysis revealed significant differences between written (SSJ) and spoken (SST) Slovenian.

- In SSJ, SVO was dominant (54.6%).
- In SST, SVO occurred less (39.4%) with more variability:
  - SOV: 20.9%
  - OSV: 15.3%
- Written Slovenian had a clear dominant order (SVO), while spoken Slovenian showed No Dominant Order (NDO).

## Statistical Analysis: Frequency and Proportional Distribution 1

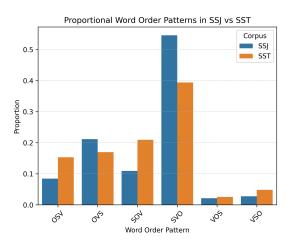


Figure: Distribution of Word Order Patterns in Written and Spoken Slovenian

## Statistical Analysis: Frequency and Proportional Distribution 2

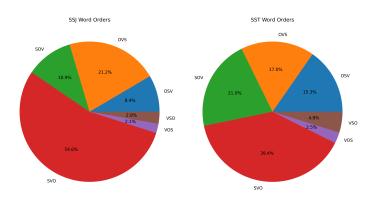


Figure: Frequency and Proportional Distribution in Written and Spoken Slovenian

## Statistical Analysis: Frequency and Proportional Distribution 3

Word order patterns in written Slovenian (SSJ) and spoken Slovenian (SST):

- In SSJ, the SVO pattern is dominant (54.6%).
- In SST, SVO is less frequent (39.4%), with more variability:
  - SOV: 20.9%
  - OSV: 15.3%

This shows that spoken Slovenian is more flexible, with word order influenced by context. Statistical analysis confirmed significant differences  $(\chi^2 = 133.59, p < 0.001)$  between the two corpora.

**Hypothesis 1:** Supported – Spoken Slovenian shows more variability than written Slovenian.

#### **Chi-Square and p-value:**

- The Chi-Square value ( $\chi^2 = 133.59$ ) indicates the size of the difference between expected and observed frequencies.
- The p-value (p < 0.001) indicates that these differences are statistically significant and not due to chance.

## Statistical Analysis: Dominant Word Orders

Dominant word order is the word order that appears most frequently in a corpus, typically more than twice as often as the next most frequent pattern.

- In SSJ, SVO is the dominant word order, appearing more than twice as often as OVS.
- In SST, there is no clear dominant order, classified as No Dominant Order (NDO).

**Hypothesis 2:** Supported – SVO dominates in SSJ, while SST shows more variability.

## Statistical Analysis: Distributional Comparisons

Word order patterns across SST and SSJ according to distributional metrics:

- **Jensen-Shannon Divergence:** 0.148 (moderate divergence)
- Entropy: SST (1.52) has more variability than SSJ (1.29)
- Euclidean Distance: 0.20 (notable but not overwhelming difference)
- Pearson Correlation: 0.93, Spearman Rank Correlation: 0.94 (strong alignment)

These values indicate that spoken Slovenian (SST) shows more variability in word order than written Slovenian (SSJ), but both corpora have similar overall ranking of patterns.

**Hypothesis 3:** Partially supported – SST shows greater variability and markedness, diverging from the typological norm.

## Statistical Analysis: Differences in Proportions 1

The heatmap shows the proportional differences between SST and SSJ:

- Positive values: Patterns more frequent in SST (spoken Slovenian)
- Negative values: Patterns more frequent in SSJ (written Slovenian)
- OSV, SOV are more common in SST, reflecting its flexibility.
- SVO dominates in SSJ, showing the structured nature of written language.
- Less common patterns (VOS, VSO) show minor differences, indicating their limited role.

## Statistical Analysis: Differences in Proportions 2

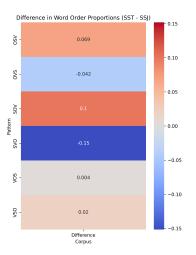


Figure: Comparison of Word Order Variability in Written and Spoken Slovenian

## Drafting the Paper

The final phase involved drafting the research paper, available here. Key points from this project include:

- Comparison of spoken and written Slovenian word orders.
- Statistical analysis and the metrics used to evaluate differences.
- Implications of these findings for linguistic theory and computational applications.
- Providing a foundation for future research on other patterns.

Since this field is so specific and there is limited research on it, these findings may be valuable for others interested in the area.

## Challenges

#### Key challenges included:

- Data extraction from WALS was difficult due to dynamic website elements, requiring a manual process.
- Tool limitations with STARK, especially in handling indirect relations.
- Probabilistic modeling was complex, indicating the need for more advanced techniques.
- Deployment of the Streamlit app faced additional difficulties.

#### Conclusion and Future Work

This project provided insights into Slovenian word order and UD application in typology. While the findings were not groundbreaking, it laid a foundation for future research.

The project also contributed to a GitHub repository.

#### **Future plans:**

- Extend analysis to other languages.
- Train models to predict word order patterns.
- Publish the dataset on HuggingFace.
- Create a Gradio app for users to test the model with their own sentences.