

# Slavic Diachronic Corpora: Challenges and Perspectives

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Project INCOMSLAV  
Mutual Intelligibility and Surprisal in Slavic Intercomprehension

Historical Corpus Linguistics: Methods and Applications

Saarbrücken, 16-17 June 2016



UNIVERSITÄT  
DES  
SAARLANDES

# Research Group



*Statistical  
NLP*



*Slavonic  
Studies*

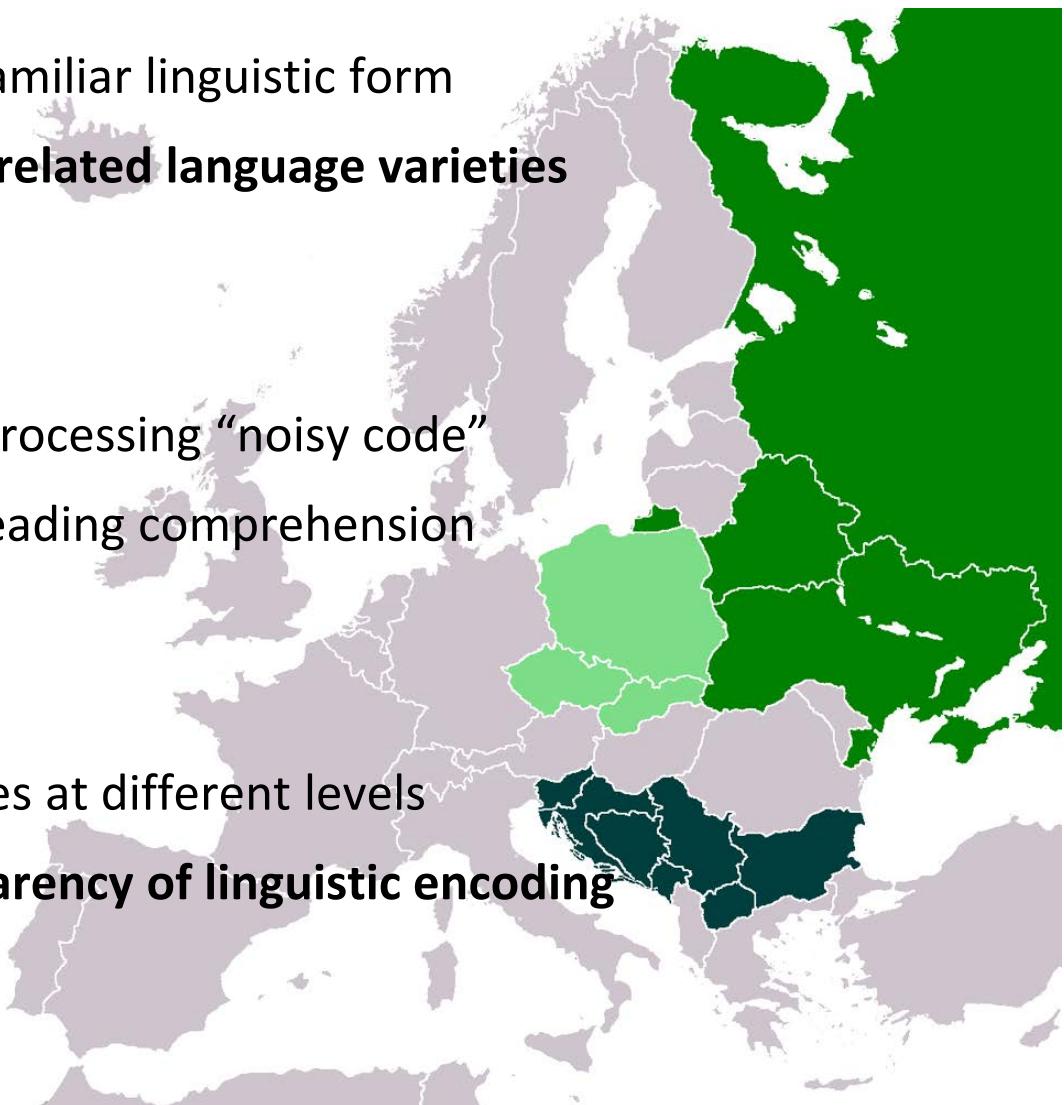


*Computational &  
Slavic Linguistics*



# Focus on Slavic Intercomprehension

- Receptive multilingualism
  - inter-lingual tolerance to unfamiliar linguistic form
  - ability to understand texts in **related language varieties**
- Surprisal
  - information-theoretic view: processing “noisy code”
  - **written input:** cross-lingual reading comprehension
- Mutual intelligibility
  - measurable linguistic distances at different levels
  - basic factor to model: **transparency of linguistic encoding**



# Slavic Intercomprehension Matrix

related language varieties  
written input  
transparency of linguistic encoding

	East Slavic			West Slavic				West South Slavic				East South Slavic		
	Russ	Ruth		Sorb	Lech	Cz-Slk		SCB	Slv					
ISO-code	1.	2.	3.	4.	5.	6.	7.	8.	9.	10.	11.	12.	13.	14.
1. Russian	rus	1(2)	1(3)	1(4)	1(5)	1(6)	1(7)			1(10)	1(11)	1(12)	1(13)	1(14)
2. Ukrainian	2(1)	ukr	2(3)	2(4)	2(5)	2(6)	2(7)			2(10)	2(11)	2(12)	2(13)	2(14)
3. Belarusian	3(1)	3(2)	bel	3(4)	3(5)	3(6)	3(7)			3(10)	3(11)	3(12)	3(13)	3(14)
4. Upper Sorbian	4(1)	4(2)	4(3)	hsb	4(5)	4(6)	4(7)	4(8)	4(9)					
5. Lower Sorbian	5(1)			5(4)	dsb	5(6)	5(7)	5(8)	5(9)					
6. Polish	6(1)			6(4)	6(5)	pol	6(7)	6(8)	6(9)	6(10)			6(13)	5(14)
7. Czech	7(1)			7(4)	7(5)	7(6)	ces	7(8)	7(9)	7(10)	7(11)	7(12)	7(13)	6(14)
8. Slovak	8(1)	8(2)	8(3)	8(4)	8(5)	8(6)	8(7)	slk	8(9)	8(10)	8(11)	8(12)	8(13)	7(14)
9. Bosnian	9(1)	9(2)	9(3)			9(6)	9(7)	10(7)	bos	9(10)	9(11)	9(12)	9(13)	8(14)
10. Croatian	10(1)	10(2)				10(6)	10(7)	11(7)	10(9)	hrv	10(11)	10(12)	10(13)	9(14)
11. Serbian	11(1)	11(2)				11(6)	11(7)	11(8)	11(9)	11(10)	srp	11(12)	11(13)	10(14)
12. Slovene	12(1)	12(2)				12(6)	12(7)	12(8)	12(9)	12(10)	12(11)	slv	12(13)	11(14)
13. Macedonian	13(1)	13(2)				13(6)	13(7)	13(8)	13(9)	13(19)	13(11)	13(12)	mkd	13(14)
14. Bulgarian	14(1)	14(2)	14(3)	14(4)	14(5)	14(6)	14(7)	14(8)	14(9)	14(10)	14(11)	14(12)	14(13)	bul

Notation: A(B)

A = decoder's language; B = language of the stimulus

# The diachronic dimension

related language varieties

written input

transparency of linguistic encoding

- Language-internal (direct): languages change in time
- Cross-linguistic (indirect): in relation to a common ancestor

Proto-Slavic 6 BC – 6 AD	Church Slavonic			
	East	Old Russian (X-XV)	Middle Russian (XV-XVII)	Modern Russian
	South	Old Bulgarian / OCS (IX-XI)	Middle Bulgarian (XII-XVIII)	Modern Bulgarian
	West	Old Polish (XII-XV)	Middle Polish (XVI-XVIII)	Modern Polish
		Old Czech (X-XV)	Middle Czech (XVI-XVIII)	Modern Czech

Cyrillic script

Latin script

# From Proto-Slavic to Modern Slavic

related language varieties

written input

transparency of linguistic encoding

Latin script		← →	Cyrillic script			
PL	CZ	Proto-Slavic	OCS	RU	BG	
brat	bratr	*brat(r)ъ	брат(р)ъ	брат	брат	<i>brother</i>
syn	syn	*synъ	сынъ	сын	син	<i>son</i>
dom	dům	*domъ	домъ	дом	дом	<i>house</i>
rzeka	řeka	*rěka	рѣка	река	река	<i>river</i>
śnieg	sníh	*snědъ	снѣгъ	снег	сняг	<i>snow</i>
chlеб	chléb	*xлѣбъ	хлѣбъ	хлеб	хляб	<i>bread</i>
wino	víno	*vino	вино	вино	вино	<i>wine</i>
woda	voda	*voda	вода	вода	вода	<i>water</i>
ryba	ryba	*ryba	рыба	рыба	риба	<i>fish</i>
oko	oko	*oko	око	око	око	<i>eye</i>
ręka	ruka	*rǫka	рѧка	рука	ръка	<i>hand</i>
żyć	žíti	*žiti	жити	жить	живея	<i>live</i>
biały	bílý	*bělъ(jъ)	бѣлъ	белый	бял	<i>white</i>

# Diachronic and synchronic variants

related language varieties

written input

transparency of linguistic encoding

- e.g. middle PL: *większy*      modern CZ: *větší*      (bigger)  
modern PL: *większy*

→ middle PL closer to modern CZ

- transformable by diachronically-based cross-lingual correspondence rules
- will be tested in experiments with native speakers

# Orthography as primary interface

related language varieties

written input

transparency of linguistic encoding

- **Orthographic correlates** (used in linguistic analyses of inter-lingual similarity)
  - **in Slavic vocabulary** (common heritage): historical correspondence rules
  - **in internationalisms** (modern vocabulary): diff. in modern orthographies
  - **in morphology**: inflectional and derivational
- Major spelling issues in historical corpus linguistics
  - **Difference**: historical spelling differs from modern spelling (diachronic)
  - **Variance**: historical spelling is variable and inconsistent (synchronic)
  - **Uncertainty**: digital text is result of interpretation and transcription, which introduces artefacts and errors

# Slavic diachronic corpora

- DIAKORP (CZ) <https://ucnk.ff.cuni.cz/english/diakorp.php>

- Vokabulář webový (CZ)

...

- PolDi (PL) <http://rhssl1.uni-regensburg.de/SlavKo/korpus/poldi>

- Korpus tekstów staropolskich do roku 1500 (PL)

...

**R**ugie podobieństwo przeſo-  
jęt im / mowiąc ; Podobne  
jest królestwo niebieskie c̄łomieko-  
wi rozsiewającemu dobre nasienie  
na roli swojej. A gdy ludzie gąs-

Drugie podobieństwo przełożył im,  
mówiąc: Podobne jest królestwo niebieskie  
człowiekowi, rozsiewającemu dobre  
nasienie na roli swojej.

- RRuDi (RU) <http://rhssl1.uni-regensburg.de/SlavKo/korpus/rrudi-new>

- RNC: Diachronic corpus (RU)

■ Old Russian & Birch bark letters

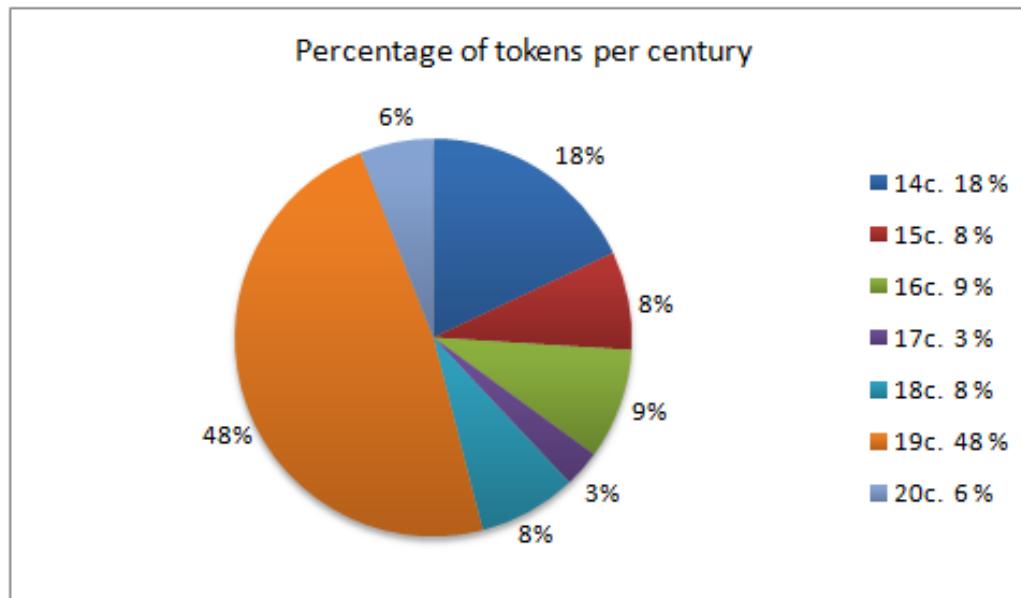
■ Church-Slavonic

■ Middle Russian



## e.g. Diachronic section of the Czech National Corpus

- <http://wiki.korpus.cz/doku.php/en:cnk:diakorp>



- different spelling systems: **simple, digraphic, diacritical** & combinations thereof
- **transcribed, not transliterated**: enabling search as in the synchronic sections
- **tagged**: to preserve certain information, which is lost when transcribing
- **hyperlemmata** to allow variety-independent search, e.g. use hyperlemma *kůň* to also find older Czech forms *kóň* and *kuoň*

# e.g. Polish Diachronic Online Corpus

- tools for modern Polish + manual annotation
- Morfeusz** as external “generic tagger” patched up with post-processing rules
- Annis-2** as [database and web interface](#) – to visualize and make queryable  
“complex multilevel linguistic corpora with diverse types of annotation”

The screenshot shows the Polish Diachronic Online Corpus interface. On the left, there is a search interface with fields for 'Result' (5973), 'More Corpora' (checkboxes for BW, BZ, EwZam, GornickiDroga, JanczarPamietniki, KazGn, KazSw, KodDzial), and 'Search' (Context Left: 2, Context Right: 2, Results Per Page: 10). On the right, the main window displays search results and token annotations. The results list includes entries like 'iżci się jest {był} krolewic', 'się Kryst jest był narodził', and 'nasz [z]bawiciel jest {był} narodził'. Below the results is a detailed view of a specific token annotation for 'jest' in the sentence 'się Kryst jest był narodził'. The annotation grid shows:

Div1n	unnamed				
Div1type	kazanie				
lemma	się	Kryst	być	być	narodzić
tag	qub	subst:sg:nom:m1	fin:sg:ter:imperf	praet:sg:m1.m2.m3:imperf	praet:sg:m1.m2.m3:perf
tok	się	Kryst	jest	był	narodził

Annotations for 'jest' include 'paula' and 'paula text'. The interface also features a 'Token Annotations' dropdown and various navigation buttons at the top.

e.g. Old Russian section of the Russian National Corpus

# Древнерусский корпус

Орфография:  точная  упрощенная  модернизированная

## Поиск точных форм

А Б В

Слово или фраза

искать

очистить

## Русско-церковнославянская клавиатура

Упрощенная орфография

### 1. Александрия [омонимия снята] [Все примеры \(2\)](#)

, аки молниа. възжалкавъ же см. въсхоте(х) пріятти **хлѣба**, и призвахъ [Александрия] [омонимия снята] ← →  
боудеть. се же рекъ, александъръ принесе къ даньдамью злато, и **хлѣбы**. [Александрия] [омонимия снята] ← →

### 2. Волынская летопись [омонимия снята] [Все примеры \(1\)](#)

лноу. а по стоу. **хлѣба**. а по плати цебровъ [Волынская летопись] [омонимия снята] ← →

хлѣбы	
Лемма	хлѣбъ
Грамматика	сущ. м, мн, вин
Доп. признаки	086:20, bcomm, bmark, last

### 3. Изборник [омонимия снята] [Все примеры \(12\)](#)

въ свою обитѣль · обывъ ти боуди съ ними **хлѣбъ** твои · обышты чаша [Изборник] [омонимия снята] ← →  
тромпезою · поманн соихъ **хлѣбъ** гадоуштааго · и не могоуштааго [Изборник] [омонимия снята] ← →

Сообщить об ошибке...

# Overview of project activities

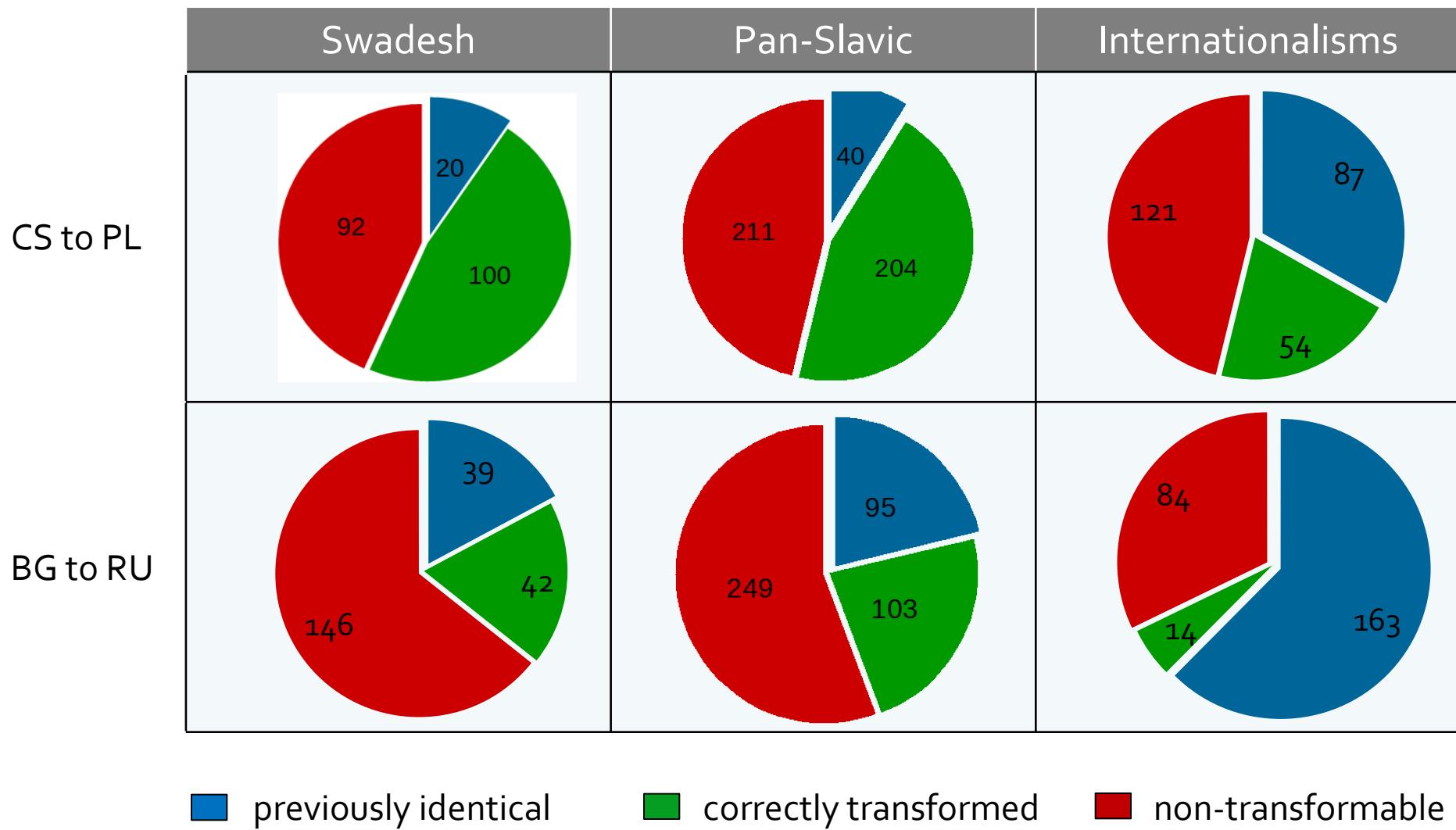
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- Establishing **orthographic correlates**
  - Czech↔ Polish; Bulgarian↔ Russian
  - **informed by comparative historical linguistic studies**
- Collecting and preparing **parallel lexical recourses**
  - Pan-Slavic vocabulary; internationalisms; Swadesh lists
  - 100 most frequent nouns extracted from national corpora (CZ, PL, RU, BG)
- Computational **transformation experiments**
  - applying diachronically-based orthographic correspondence rules on parallel word sets
  - obtaining additional statistical orthographic and morphological correspondences via MDL model

# Diachronically motivated regular correspondences

	Czech	Polish	Bulgarian	Russian
horse	kůň	koń	кон	конь
body	tělo	ciąło	тяло	тело
sea	moře	morze	море	море
brush	štětka	szczotka	чётка	щётка
cow	kráva	krowa	крава	корова
before	před	przed	пред	перед
head	hlava	głowa	глава	голова
voice	hlas	głos	глас	голос
full	plný	pełny	пълен	полный
yellow	žlutý	żółty	жълт	жёлтый
wolf	vlk	wilk	вълк	волк

# Results of applying linguistic rules on parallel word sets



# Methodological considerations

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- Diachronic linguistics aligns cognate words, looking for **regular segmental correspondence** (in order to identify sound equivalences)
  - Can the recognition of semantically related words be improved?
  - Can alignment be made more sensitive to phonetic conditioning?
  - Can models for identifying correspondences be generalized to dozens, or even hundreds of related varieties?
  - Can borrowings be identified along with cognates?
- Virtually all NLP techniques and tools assume (and require) **consistent orthography**; surface form is the key used for looking up further information
- What if spelling differs from standard orthography? What if spelling is variable? (Note: spelling also concerns tokenization)

# MDL

- Formalize as associated strings, analyze data
- Works on/produces alignments of data
- No other assumptions made

(BG)	м	и	л				(BG)	п	и				я
(RU)	м	и	л	ы	й		(RU)	п	и				ть
(PL)	m	i	ł	y			(PL)	p		i		ć	
(CS)	m	i	l	ý			(CS)	p		í		t	

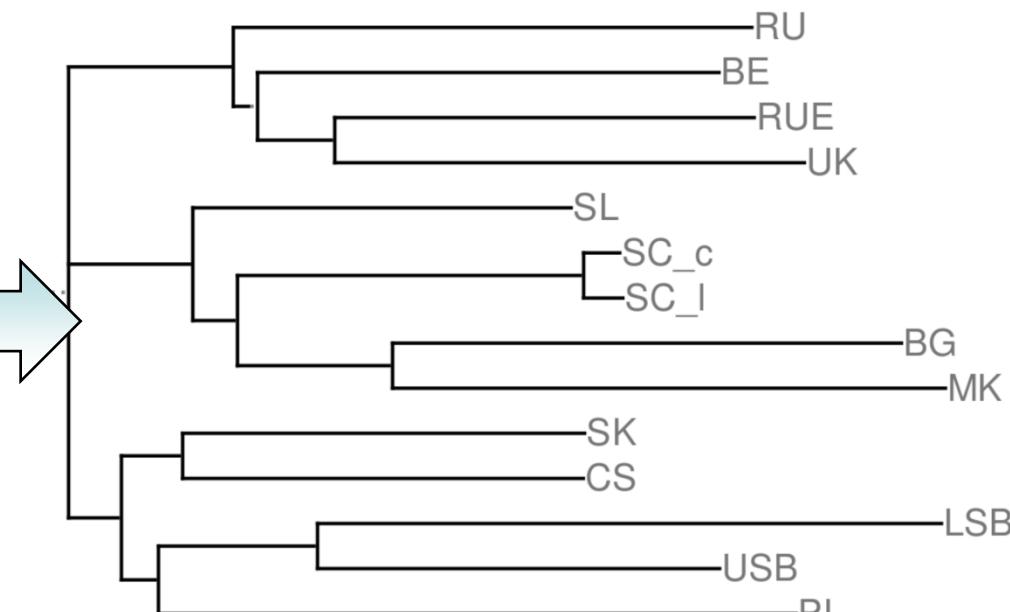
- What can we do with this?

Objective string-level similarity:  
measures regularity and complexity of shared structure

# Quantify Linguistic Similarity

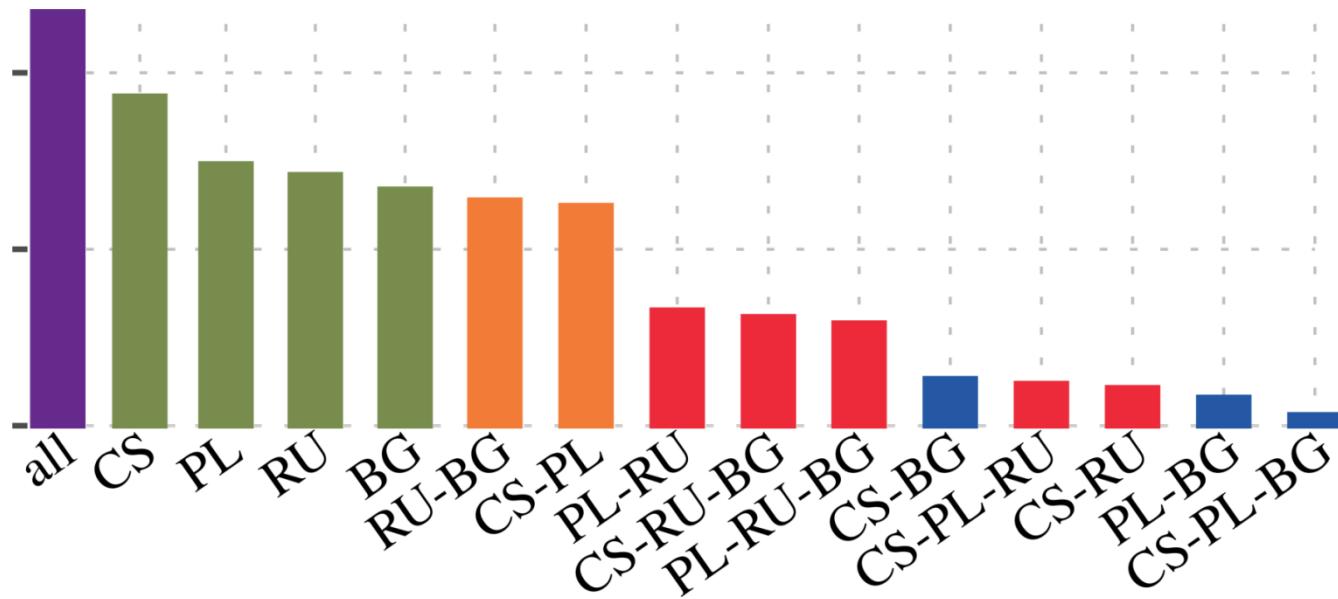
## A) Phylogenetic analysis

	usb	lsb	CS	SK	PL	SL	SC <sub>l</sub>	SC <sub>c</sub>	MK	BG	RU	UK	rue	BE
usb	.00	<b>.52</b>	.53	.52	.60	.57	.61	.62	.76	.75	.68	.70	.67	.64
lsb	<b>.52</b>	.00	.65	.66	.72	.67	.68	.71	.87	.85	.80	.82	.78	.74
CS	.53	.65	.00	<b>.41</b>	.56	.50	.53	.55	.71	.69	.61	.64	.58	.59
SK	.52	.66	<b>.41</b>	.00	.58	.48	.51	.56	.68	.66	.60	.65	.59	.60
PL	.60	.72	<b>.56</b>	.58	.00	.64	.64	.67	.82	.79	.71	.74	.69	.63
SL	.57	.67	.50	.48	.64	.00	<b>.36</b>	.39	.59	.58	.61	.65	.60	.61
SC <sub>l</sub>	.61	.68	.53	.51	.64	.36	.00	<b>.04</b>	.54	.57	.63	.66	.62	
SC <sub>c</sub>	.62	.71	.55	.56	.67	.39	<b>.04</b>	.00	.51	.53	.60	.63	.59	.59
MK	.76	.87	.71	.68	.82	.59	.54	<b>.51</b>	.00	.54	.74	.78	.75	.75
BG	.75	.85	.69	.66	.79	.58	.57	<b>.53</b>	.54	.00	.70	.77	.70	.71
RU	.68	.80	.61	.60	.71	.61	.63	.60	.74	.70	.00	.52	.53	<b>.51</b>
UK	.70	.82	.64	.65	.74	.65	.66	.63	.78	.77	.52	.00	.45	<b>.45</b>
rue	.67	.78	.58	.59	.69	.60	.62	.59	.75	.70	.53	<b>.45</b>	.00	.54
BE	.64	.74	.59	.60	.63	.61	.63	.59	.75	.71	.51	<b>.45</b>	.54	.00



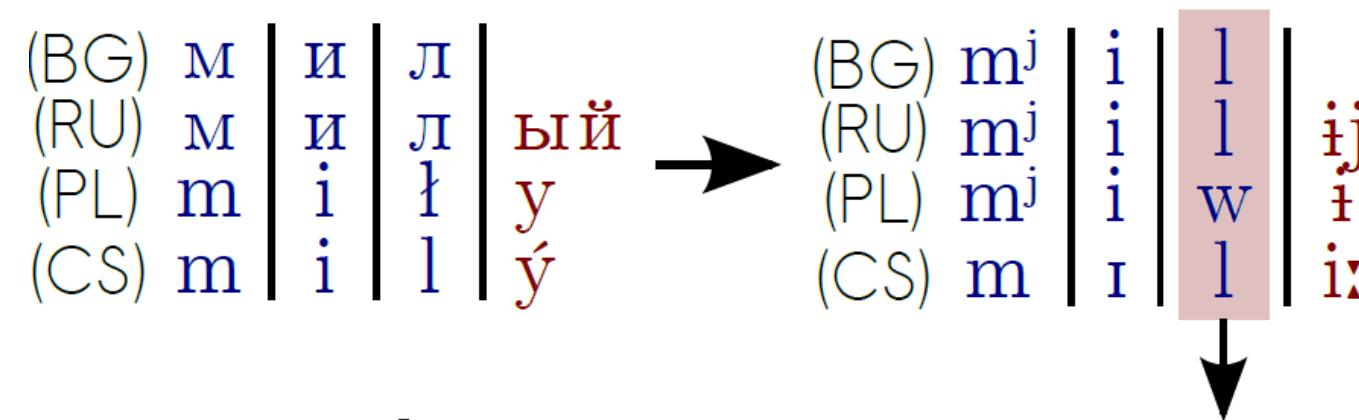
# Quantify Linguistic Similarity

B) Quantify similarity within subsets of languages



# Quantify Linguistic Similarity

C) Analyze both sound correspondences and sound changes



approximant, voiced, oral, central, pulmonic, **alveolar**

approximant, voiced, oral, central, pulmonic, **alveolar**

approximant, voiced, oral, central, pulmonic

approximant, voiced, oral, central, pulmonic, **alveolar**

labial. velar

# Find (And Use) Correspondences

D) Reconstruct unknown forms

(BG)	л	и	п	а
(RU)	л	и	п	а
(PL)	ł			
(CS)	l	í	p	a

(OCS)	sъč	е	stъ	је
(PL)	szcz	ę	ści	е
(CS)	št	ě	st	í
(RU)	сч	а	сть	е
(BG)	щ	а	ст	ие

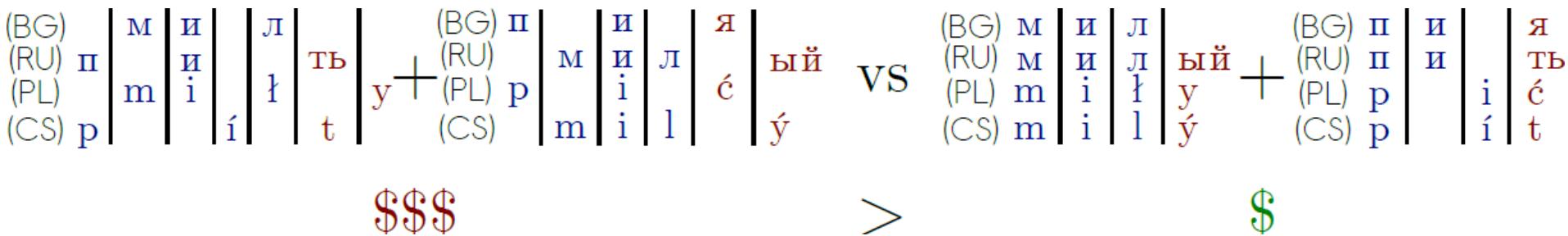
E) Analyze divergences from common spelling

(BG)	л	и	п	а
(RU)	л	и	п	а
(PL)	ł	i	p	a
(CS)	l	í	p	a

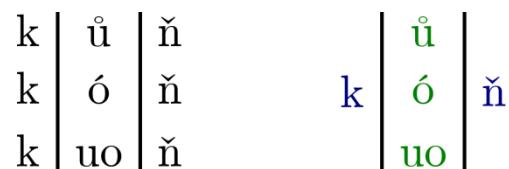
(OCS)	sъč	е	stъ	је
(PL)	szcz	ę	ści	е
(CS)	št	ě	st	í
(RU)	сч	а	сть	е
(BG)	щ	а	ст	ие

# Find (And Use) Correspondences

F) Align words across languages and across time



G) Unify orthographic variants



# The ultimate linguistic tool ☺ ... coming soon

# Thank you!