# Unified Simplified Grapheme Acoustic Modeling for Medieval Latin LVCSR

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#### What is the problem with Latin speech recognition?

- Latin is not spoken natively
- There is no available speech database, and it is resource-heavy to create one
- Many variants/dialects exists, and we can only make guesses about the pronunciation
- The pronunciation mainly depends on
  - the era of the read text
  - the native language of the speaker

#### Text data

Regions of origin: Kingdom of Bohemia (CZ), Kingdom of Hungary (HU), Kingdom of Poland (PL)

- In-domain data (Monasterium): medieval charters (HU), 480k/35k token/type
- Background data (Latin Library): historical texts, 1.3M/115k token/type

## Speech data

Languages: CZ, HU, PL, RO

# Test data

- Native language of test speakers: CZ, HU, PL, SK
- Region of read text: CZ, HU, PL

## Spelling variants

jam –¿ iam
judex –¿ iudex
gracia –¿ gratia

# Perplexity measures on test

Table 1: Perplexity/OOV rate

	Te	Text region				
Corpus	CZ	HU	PL	All		
Monasterium	551	82	3130	671		
Latin Library	3266	3549	2305	4303		
Interpolated	924		2288	953		

# Language model

#### Acoustic model

### Dimensions of data

Native language of test speakers: CZ, HU, PL, SK

Region of read text: CZ, HU, PL
Speech data: CZ, HU, PL, RO

Model type: baseline, knowledge-based, USG

#### Conclusions

- Four-language USG is the best
- It is able to generalize over different speaker test sets

## Baseline Grapheme Model

Languages: Czech (CZ), Hungarian (HU), Polish (PL), Romanian (RO)

- All graphemes are trained
- Only those grapheme models are retained that are part of the Latin alphabet

Table 2: Word Error Rate (WER[%]) results for monolingual grapheme-based acoustic models of Czech, Hungarian, Polish and Romanian (CZ, HU, PL, RO).

	S	Speaker					
AM Language	CZ	HU	PL	SK	$\sum$		
CZ	53.6	73.8	62.9	45.7	59.0		
HU	33.7	28.6	47.1	29.1	34.6		
PL	65.0	67.6	46.4	51.1	57.5		
RO	53.6	69.1	44.7	43.8	52.8		

## Knowledge-based grapheme-to-phoneme (G2P) mapping

Languages: CZ, HU

Table 3: Latin digraph context-insensitive rewrite rules.

	Digraph						
	ae	oe	ph	qu			
CZ	e	oe	f	kv			
HU	e	Ø	f	kv			

Table 4: Latin context-sensitive rewrite rules. V: vowel, VP: palatal vowel,  $^{\text{VP}}$ : everything but a palatal vowel, C: consonant, \*: zero or any,  $^{\text{c}}$ : beginning of word,  $[^{\text{c}}stx]$ : not s, t or x.

GR	c	C	ch	ch	gu	gu	ti	ti
PH	ts	k	h	k	gv	gu	tsi	ti
rule	cVP	c^VP	VC*ch	^C*ch	guV	guC	$\int \int stx dt$	tiC

Table 5: WER[%] for Czech-Latin source-target G2P model. Acoustic model training set: 76 hours.

	Latin Test Text						
Speaker	CZ	HU	PL	$\sum$			
CZ			49.1				
HU			58.7				
PL	53.3	18.2	53.2	41.6			
SK	30.3	30.0	44.0	34.8			
$\sum$	43.9	28.9	50.8	41.2			

Table 6: WER[%] for Hungarian-Latin source-target G2P model. Acoustic model training set: 567 hours.

	Latır	Latin Test Text					
Speaker	CZ	HU	PL	$\sum$			
CZ	19.4	<b>6.4</b>	28.0	17.9			
HU		25.4					
PL	28.9	15.4	41.3	28.5			
SK	20.4	9.1	22.9	17.5			
$\sum$	22.6	12.5	28.1	21.1			

# Unified Simplified Grapheme (USG) Model

Languages: CZ, HU, PL, RO

Table 7: Simplification examples for the unified model.

Language	CZ	HU	PL	RC
Orthographic form	řekl	őz	miś	apă
USG transcription	rekl	ΟZ	mis	apa

Table 8: WER[%] for all the three-language

USG models.	S	Speaker					
AM Language	CZ	HU	PL	SK	$\sum$		
CZ+HU+PL	28.2	28.2	27.7	22.4	26.6		
CZ+HU+RO	23.3	21.4	23.9	19.2	21.9		
CZ+PL+RO	24.6	33.1	25.6	19.8	25.8		
HU+PL+RO	24.8	21.5	25.7	20.7	23.2		

Table 9: WER[%] for USG model of Czech, Hungarian, Polish and Romanian (CZ+HU+PL+RO).

	Latin Test Text							
Speaker	CZ	HU	PL	$\sum$				
CZ	20.4	11.8	30.7	21.0				
HU	21.1	14.6	25.7	20.5				
PL			33.0					
SK	14.5	12.7	24.8	17.3				
$\overline{\sum}$	19.9	12.2	29.0	20.4				