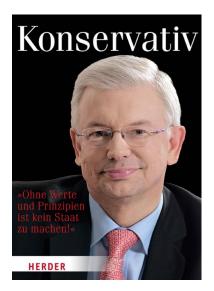
LingPy – A Python Library for Quantitative Tasks in Historical Linguistics

Johann-Mattis List*

*Institut für Romanistik II Heinrich Heine University Düsseldorf

19. Juli 2012

What the *** is historical linguistics?



Konservativ kommt nicht von Konserve!

Angela Merkel (10. April 2000)

konservativ

konservativ

Part of Speech adjective frequency moderate

konservativ

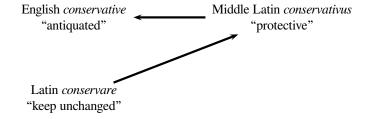
Part of Speech frequency	adjective moderate
meaning synonyms	"sticking to the traditional" "rückschrittlich", "antiquiert", "rückständig", "unzeitgemäß"
pronunciation	kənzervati:f

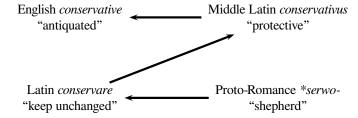
konservativ

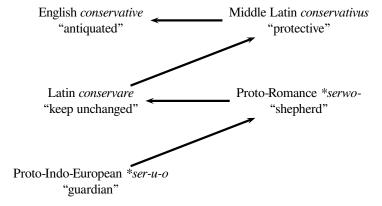
Part of Speech	adjective
frequency	moderate
meaning	"sticking to the traditional"
synonyms	"rückschrittlich", "antiquiert", "rückständig", "unzeitgemäß"
pronunciation	kənzervati:f
origin	English <i>conservative</i>
origin	Lilyiisii conservative

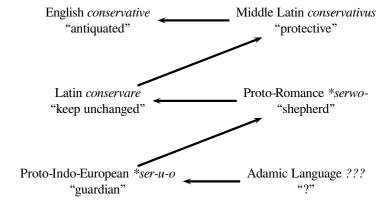
English conservative "antiquated"

English conservative Middle Latin conservativus "antiquated" "protective"









Konserve

Konserve

Part of Speech noun

frequency moderate

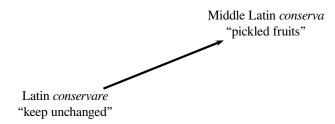
Konserve

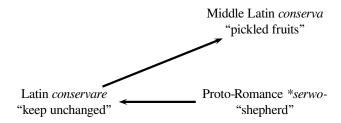
Part of Speech frequency	noun moderate	
meaning synonyms pronunciation	"preserve tin" "Büchse", "Konservendos kənzervə	•

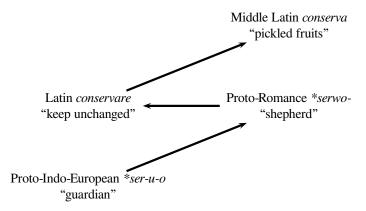
Konserve

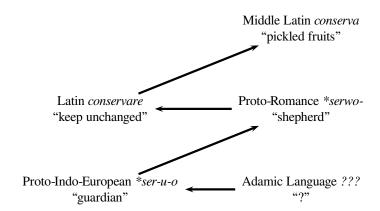
Part of Speech frequency	noun moderate
meaning synonyms	"preserve tin" "Büchse", "Konservenbüchse", "Konservendose"
pronunciation	kənzervə
origin	Middle Latin conserva

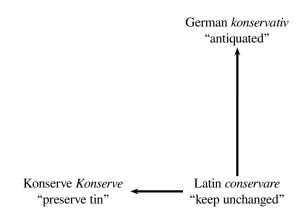
Middle Latin conserva











Konservativ kommt nicht von Konserve!

Konservativ kommt nicht von Konserve! Q.E.D.

What the *** is historical linguistics?

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Historical linguistics is a (scientific) discipline that does not specifically care about what words mean, but where they come from...

Structure of the Talk

- Basic Ideas
- Sequence Modelling
- 3 Phonetic Alignment
- 4 Automatic Cognate Detection

 LingPy is a Python library (see http://lingulist.de/lingpy) for automatic tasks in historical linguistics.

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- LingPy can be invoked from the Python shell or inside Python scripts (examples are given in the online documentation).

Current Features

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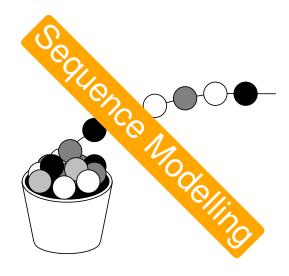
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- calculate basic prosodic characteristics of phonetic sequences
- carry out pairwise alignment analyses of phonetic sequences
- carry out multiple alignment analyses of phonetic sequences
- automatically search for cognates and etymologically related words in multilingual word lists

 adapt common techniques for sequence comparison and phylogenetic reconstruction to the specific needs of historical linguistics (general idea)

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- construct realistic models of phonetic sequences by distinguishing external and internal representations (module linapy.sequence)
- compare sequences in a way that closely reflects common linguistic theory (module lingpy.compare)
- compare languages in a way that closely reflects the basic methods of historical linguistics (module lingpy.lexstat)



Synchronic Sequence Similarity

Sequences are judged to be similar if the segments of the sequences are phonetically similar ('phenotypic resemblence', Lass 1997).

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Diachronic Sequence Similarity

Sequences are judged to be similar if the segments of the sequences correspond *systematically* ('genotypic resemblence', Lass 1997).

Synchronic Sequence Similarity

Diachronic Sequence Similarity

Synchronic Sequence Similarity

1		•	\approx	Malay	mata	'eye'
Greek	всзв	'god'	\approx	Spanish	dios	'god'

Diachronic Sequence Similarity

Synchronic Sequence Similarity

Greek	mati	'eye'	\approx	Malay	mata	'eye'
Greek	всзв	'god'	\approx	Spanish	dios	'god'

Diachronic Sequence Similarity

German	ts ^h a:n	'tooth'	\approx	English	tυ:θ	'tooth'
Spanish	et∫o	'fact'	\approx	French	fε	'fact'



Sound Classes

Sounds which often occur in correspondence relations in genetically related languages can be clustered into classes (types). It is assumed "that phonetic correspondences inside a 'type' are more regular than those between different 'types'" (Dolgopolsky 1986: 35).

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- (k)
- (g)
- (b)

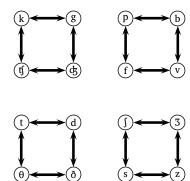
- (tJ)
- **(**tz)
- (f)

- (t)
- (d)
- (3)

- (θ)
- (ð)
- (s)

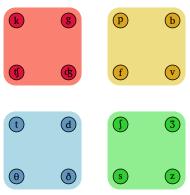
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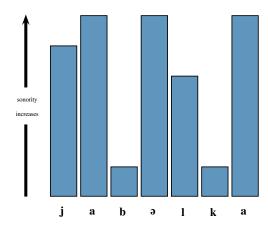
 sound change occurs more frequently in prosodically weak positions of phonetic sequences (Geisler 1992)

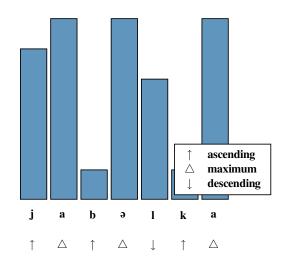
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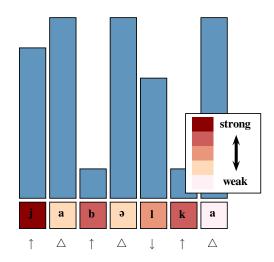
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- prosodic context can be modelled by representing a sequence by a prosodic string, indicating the different prosodic contexts of each segment
- based on the relative strength of all sites in a phonetic sequence, substitution scores and gap penalties can be modified when carrying out alignment analyses

b ə a l k







>>> from lingpy import *

```
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>>> konservativ = Sequence("konzervati:f")
```

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>>> konservativ = Sequence("konzervati:f")
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```

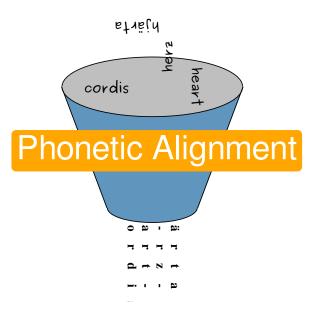
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>>> from lingpy import *
>>> konservativ = Sequence("konzervati:f")
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KUNSERBATIB
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konzεrvati: f
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17437537173
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>>> print konservativ.prostring
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17437537173
>>> print konservativ.prostring
#VcCvcCvCv$
```



Excursus: Alignment Analyses

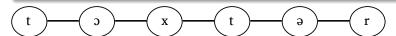
Alignment Analyses

Excursus: Alignment Analyses

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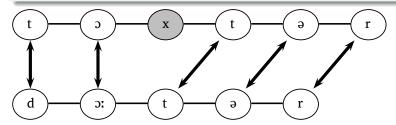
Alignment Analyses





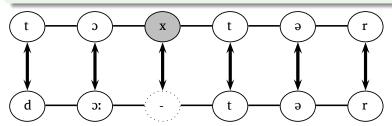
Excursus: Alignment Analyses

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Sound-Class Based Alignment (SCA, List 2012a)

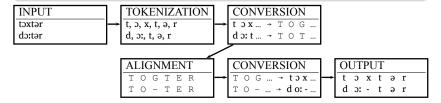
Sound-Class Based Alignment (SCA, List 2012a)

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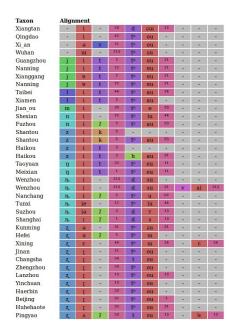
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>>> from lingpy import *
>>> konservativ = "konzervati:f"
>>> Konserve = "konzerva"
>>> pair = Pairwise(konservativ, Konserve)
```

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>>> Konserve = "kɔnzɛrvə"
>>> pair = Pairwise(konservativ,Konserve)
>>> pair.align()
```

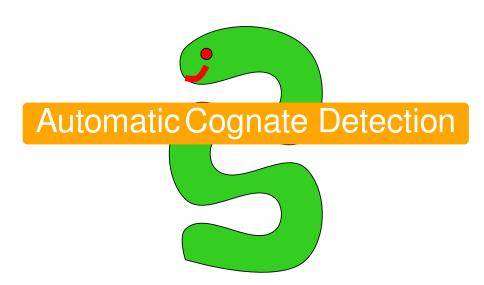
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k ɔ n z ɛ r v a t iː f
k ɔ n z ɛ r v - - ə -
0.3
```



Phonetic Alignment



Language-Specific Similarity Measure

 recall the aforementioned distinction between synchronic and diachronic similarity

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- diachronic similarity is the basic of all traditional approaches to cognate detection

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Meaning	German	Dutch	English	
"tooth"	Zahn [tsa:n]	tand [tant]	tooth [t υ:θ]	
"ten"	zehn [ts e:n]	tien [ti:n]	ten [ten]	
"tongue"	<i>Zunge</i> [ts ບ໗ə]	tong [t ວ໗]	tongue [t ոդ]	

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Meaning	Shanghai	Beijing	Guangzhou
"nine"	[<mark>t¢</mark> iγ³5]	Beijing [tc iou ²¹⁴]	[<mark>k</mark> eu ³⁵]
"today"	[tc iŋ55tsɔ21]	Beijing [tc iə ⁵⁵]	[<mark>k</mark> em ⁵³ jet²]
"rooster"	[koŋ ⁵⁵ tç i ²¹]	Beijing[kuŋ ⁵⁵ tc i ⁵⁵]	[kˈɐi ⁵⁵ koŋ ⁵⁵]

```
LexStat (List 2012b)
```

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 LexStat is a method for the automatic detection of cognates in multilingual word lists

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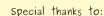
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- LexStat yields transparent decisions which can be directly examined by the researcher

ID	Items	German	English	Swedish
1	hand	hant	hænd	hand
2	woman	fraʊ	wʊmən	kvina
3	know	kεnən	ทอช	çεna
3	know	visən	-	veːta

ID	Items	German	COG	English	COG	Swedish	COG
1	hand	hant	1	hænd	1	hand	1
2	woman	fraʊ	2	wʊmən	3	kvina	4
3	know	kεnən	5	ทอช	5	çεna	5
3	know	visən	6	-	0	veːta	6

Basic Concept: belly (ID: 4)				
CogID	Language	Entry	Aligned Entry	
6	Danish	on∧liw [?]		
7	German	baux	b au x	
7	Dutch	bœyk	b œy k	
7	Swedish	buk	b u k	
7	Norwegian	b u ːk	b u: k	
8	English	beli		
9	Swedish	ma:ge	m a: g e	
9	Norwegian	ma:gə	m a: g ə	
9	Danish	mæ:və	m æ: v ə	
10	Icelandic	k ^h vi:ðyr		





- · The German Federal Mi- Q nistry of Education and Research (BMBF) for funding our research project.
- · Hans Geisler for his helpful, critical, and inspiring support.

