

# Data in computational historical linguistics

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# Background

- comparative method strongly focuses on two types of data:
  - morphological paradigms
  - regular sound correspondences
- both are not very suitable for computational approaches, because
  - morphological categories are not easily comparable across languages, especially if we look individual language families
  - also, isolating languages have no morphology
  - identifying regular sound correspondences automatically is a surprisingly hard problem, due to data sparseness
  - currently one of the hot topics, far from resolved (List, 2014; Hruschka et al., 2015; Bouchard-Côté et al., 2013)

# Background

- what we need (especially if we apply statistical methods):
  - data types which are applicable to all natural languages
  - ideally **lots** of data
- current practice:
  - word lists + expert annotations about cognacy (currently the dominant paradigm)
  - unannotated word lists in phonetic transcriptions
  - discrete grammatical categorizations (compiled by human experts)

# Cognate-coded Swadesh lists

# Swadesh lists

- collections of 100 – 200 concepts (there are different versions)
- *core vocabulary*:
  - not culture dependent
  - diachronically stable, i.e. resistant both against semantic change and against borrowing
- proposed by Morris Swadesh (Swadesh, 1955, 1971) to facilitate an early attempt to automatize certain tasks in historical linguistics
- popular among computational historical linguistics because *it is a standard*
- see (List, 2016) for a thoughtful discussion of the notion of cognacy

# Cognates

- Cognates are words that have the same origin

Latin *filius* ⇒ French *fils*, Italian *figlio*

- traditionally, cognacy excludes loanwords, but terminology among computationalists is sometimes less strict:

Latin *persona* ⇒ English *person*

would also qualify as cognate pair

- on average, the closer two languages are related, the more cognate pairs they share

# Cognates

- during language change, the word for a given concept is sometimes replaced by a non-cognate one
- causes: semantic change, borrowing, morphological word formation
  - 'bone': Old High German *Bein* (cognate to Engl. *bone* ⇒ New High German *Knochen*)
  - *Bein* is still part of the German lexicon, but it now means *leg*
- *cognate replacement* is comparable to a mutation in biological evolution

# Cognates

## Caveats

- cognacy is not binary, but a matter of degree
  - English *woman* ← Old English *wif-man*
  - first component is cognate to *wife*, German *Weib* etc., and second component to *man*, German *Mann* etc. Are *woman* and *Weib* cognate or not?
- for distantly related languages, experts often disagree about cognacy  
*Ancient Greek σύλη/Latin silva ‘woods’*

# IELex

- *Indo-European Lexical Cognacy Database*
- freely available online at <http://ielex.mpi.nl/>
- based on Dyen et al. (1992)
- current version curated by group at MPI Nijmegen
- recently migrated to new MPI Jena; new version not public yet

- 207-item Swadesh lists for 135 Indo-European languages
- words in orthographic and partially in phonetic transcription (IPA)
- entries are assigned to *cognate classes*
- sample entries:

<i>language</i>	<i>iso_code</i>	<i>gloss</i>	<i>global_id</i>	<i>local_id</i>	<i>transcription</i>	<i>cognate_class</i>
ELFDALIAN	qov	woman	962	woman	'kèlmɪŋ	woman:Ag
DUTCH	nld	woman	962	woman	vrau	woman:B
GERMAN	deu	woman	962	woman	frau	woman:B
DANISH	dan	woman	962	woman	'gʰvenə	woman:D
DANISH_FJOLDE		woman	962	woman	kvinj	woman:D
GUTNISH_LAU		woman	962	woman	'kvim;folk	woman:D
LATIN	lat	woman	962	woman	'mulier	woman:E
LATIN	lat	woman	962	woman	'femina	woman:G
ENGLISH	eng	woman	962	woman	wumən	woman:H
GERMAN	deu	woman	962	woman	vaiþ	woman:H
DANISH	dan	woman	962	woman	'ðe:mə	woman:K

# Other publicly available cognacy data sources

- Austronesian Basic Vocabulary Database  
<http://language.psy.auckland.ac.nz/austronesian/>
- ten collections of cognate-coded Swadesh lists from various language families collected by Johann-Mattis List<sup>1</sup>
- ten collections of short (40-100 items) cognate-coded Swadesh lists from various language families collected by Søren Wichman and Eric Holman<sup>2</sup>
- 88 cognate-coded Swadesh lists from Central-Asian languages<sup>3</sup>

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<sup>1</sup>List, J.-M. (2014): Data from: Sequence comparison in historical linguistics. GitHub Repository. <http://github.com/SequenceComparison/SupplementaryMaterial>. Release: 1.0.

<sup>2</sup>Supplementary material to Wichmann and Holman (2013)

<sup>3</sup>Supplementary material to Mennecier et al. (2016)

# Phonetically transcribed Swadesh lists

# The Automatic Similarity Judgment Program

- Project originally hosted at MPI EVA in Leipzig around Søren Wichmann
- since 2009; currently version 17 (2016)
- covers more than 7,000 languages and dialects (4,574 languages with iso code)
- basic vocabulary of 40 words for each language, in uniform phonetic transcription
- freely available at <http://asjp.clld.org/>

**used concepts:** *I, you, we, one, two, person, fish, dog, louse, tree, leaf, skin, blood, bone, horn, ear, eye, nose, tooth, tongue, knee, hand, breast, liver, drink, see, hear, die, come, sun, star, water, stone, fire, path, mountain, night, full, new, name*

# The Automatic Similarity Judgment Program

## Phonetic transcription

- 41 sound classes, all coded as ASCII characters
- various diacritics to capture finer phonetic distinctions, e.g.
  - ph~: aspirated p
  - a\*: nasalized a
  - hkw\$: pre-aspirated labialized k

## Metadata

- language family, language genus, classification according to Ethnologue and Glottolog
- geographic location
- population size

# The Automatic Similarity Judgment Program

## ASJP sound classes (from Brown et al. 2013)

ASJP code symbol	Description	IPA symbols
p	voiceless bilabial stop and fricative	p,ɸ
b	voiced bilabial stop and fricative	b, β
f	voiceless labiodental fricative	f
v	voiced labiodental fricative	v
m	bilabial nasal	m
w	voiced bilabial-velar approximant	w
θ	voiceless and voiced dental fricative	θ, ð
ð	dental nasal	ɸ
t	voiceless alveolar stop	t
d	voiced alveolar stop	d
s	voiceless alveolar fricative	s
z	voiced alveolar fricative	z
c	voiceless and voiced alveolar affricate	ts, tʃ
n	alveolar nasal	n
r	voiced apico-alveolar flap and all other varieties of "r-sounds"	r, r̥, ɾ, ɾ̥
l	voiced alveolar lateral approximant	l
S	voiceless post-alveolar fricative	ʃ
Z	voiced post-alveolar fricative	ʒ
C	voiceless palato-alveolar affricate	tʃ
j	voiced palato-alveolar affricate	dʒ
T	voiceless and voiced palatal stop	c, ɟ
5	palatal nasal	ɲ
y	palatal approximant	j
k	voiceless velar stop	k
g	voiced velar stop	g
x	voiceless and voiced velar fricative	x, ɣ
N	velar nasal	ŋ

ASJP code symbol	Description	IPA symbols
q	voiceless uvular stop	q
G	voiced uvular stop	χ
X	voiceless and voiced uvular fricative, voiceless and voiced pharyngeal fricative	χ, ψ, ʜ, ғ
h	voiceless and voiced glottal fricative	h, ɦ
ʔ	voiceless glottal stop	ʔ
L	all other laterals	l, l̥, λ
!	all varieties of "click-sounds"	!, !̥,   , ‡
i	high front vowel, rounded and unrounded	i, ɪ, y, ʏ
e	mid front vowel, rounded and unrounded	e, ø
E	low front vowel, rounded and unrounded	æ, ε, œ, œ̥
ɔ	high and mid central vowel, rounded and unrounded	ɔ, ə, ɔ̥, ʊ, ə̥, ʊ̥
a	low central vowel, unrounded	a, ə
u	high back vowel, rounded and unrounded	u, ɯ
o	mid and low back vowel, rounded and unrounded	ɤ, ʌ, ɒ, ɒ̥, ɒ̥̥, ɒ̥̥̥

# Automated Similarity Judgment Project

concept	Latin	English	concept	Latin	English
<i>I</i>	ego	Ei	<i>knee</i>	genu	ni
<i>you</i>	tu	yu	<i>hand</i>	manus	hEnd
<i>we</i>	nos	wi	<i>breast</i>	pektus, mama	brest
<i>one</i>	unus	w3n	<i>liver</i>	yekur	liv3r
<i>two</i>	duo	tu	<i>drink</i>	bibere	drink
<i>person</i>	persona, homo	%opers3n	<i>see</i>	widere	si
<i>fish</i>	piskis	fiS	<i>hear</i>	audire	hir
<i>dog</i>	kanis	dag	<i>die</i>	mori	dEi
<i>louse</i>	pedikulus	laus	<i>come</i>	wenire	k3m
<i>tree</i>	arbor	tri	<i>sun</i>	sol	s3n
<i>leaf</i>	foly~u*	lif	<i>star</i>	stela	star
<i>skin</i>	kutis	%oskin	<i>water</i>	akw~a	wat3r
<i>blood</i>	saNgw~is	bl3d	<i>stone</i>	lapis	ston
<i>bone</i>	os	bon	<i>fire</i>	iNnis	fEir
<i>horn</i>	kornu	horn	<i>path</i>	viya	pE8
<i>ear</i>	auris	ir	<i>mountain</i>	mons	%maunt3n
<i>eye</i>	okulus	Ei	<i>night</i>	noks	nEit
<i>nose</i>	nasus	nos	<i>full</i>	plenus	ful
<i>tooth</i>	dens	tu8	<i>new</i>	nowus	nu
<i>tongue</i>	liNgw~E	t3N	<i>name</i>	nomen	nem

# NorthEraLex

- Massive data collection effort of the Tübingen EVOLAEMP project
- (currently) translations of 1,017 concepts into 103 (mostly) Northern Eurasian languages (cf. Dellert, 2015)
- everything transcribed in IPA
- (so far) no manual cognate coding

	Auge:::N	Ohr:::N	Nase:::N	Mund:::N	Zahn:::N	Zunge:::N	Lippe:::N	Wange:::N	\
iso									
fin	silme	korva	nene	su:	hom:as	kiešli	hu:li	pöski	
krl	silme	korva	nene	su:	hom:as	kiešli	hu:li	neola	
olo	silmy	korv	nena	su:	hom:as	kiešli	hu:li	ſök:ə	
vep	sil'm	korv	neno	su:	pi:hombaz	keļ	holi	mödpöslifk	
ekk	s'ilm	krv	n'ina	su:	hom:as	keł	hu:l	prsk	
	Gesicht:::N	Stirn:::N		...				malen:::V	\
iso									
fin	na:ma-kasuot	očča		...				ma:lotu	
krl	nakke-moata	otʃ:a		...				mołłatø	
olo	nägo	otʃ:a		...				resvija-pi:rostaa	
vep	mod	otč:s		...				pirta	
ekk	nägu	otsmik		...				ma:lliima	
	zeichnen:::V	schreiben:::V	besitzen:::V	kaufen:::V	verkaufen:::V				\
iso									
fin	pi:rta:-pi:rostaa:	kirjöt:a:	omista:	osta:				my:da	
krl	pi:rostaa	kirjot:a	omistaa	ostaa				myvvæ	
olo	resvija-pi:rostaa	kirjot:a	omistaa	ostaa				myvvæ	
vep	pirta	kirjotada	omijtada	ost:a				medo	
ekk	jo:nistama	kirjutama	omama	ostma				my:mo	
	bezahlen:::V	zahlen:::V	beherrschen:::V	ertragen:::V					\
iso									
fin	maksa:	maksa:	hal:ita	kestæ:					
krl	maksaa	maksaa	isən:mija	kestya-siityæ					
olo	maksaa	maksaa	ižəndəijsə	kærzie-kestiæ					
vep	maksta	maksta	voldzita	kant:a					
ekk	maksma	maksma	val'its'ema	toluma					

# Grammatical classifications

# Grammatical classification databases

- **World Atlas of Language Structure** (WALS) <http://wals.info/>
- **Syntactic Structures of the World's Languages** (SSWL)  
<http://sswl.railsplayground.net/>
- collection of syntactic parameters (in the Chomskyan sense) for a few dozen languages collected in the [LanGeLin](#) project (Giuseppe Longobardi)

# Expert family trees

# Expert family trees

- Ethnologue <https://www.ethnologue.com/>
- Glottolog <http://glottolog.org/>
  - in many ways improved version of Ethnologue
  - strives to apply uniform standards across all languages
  - rather conservative in accepting family status

# Running example

# Running example

- 25 living Indo-European languages
- three types of data
  - Swadesh lists in IPA transcription, taken from IELex
  - expert cognate classifications of Swadesh list entries (likewise taken from IELex),<sup>4</sup> and
  - phonological, grammatical and semantic classifications of languages (taken from WALS)

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<sup>4</sup>I only included those entries from IELex where both an IPA transcription and a cognate classification is given.

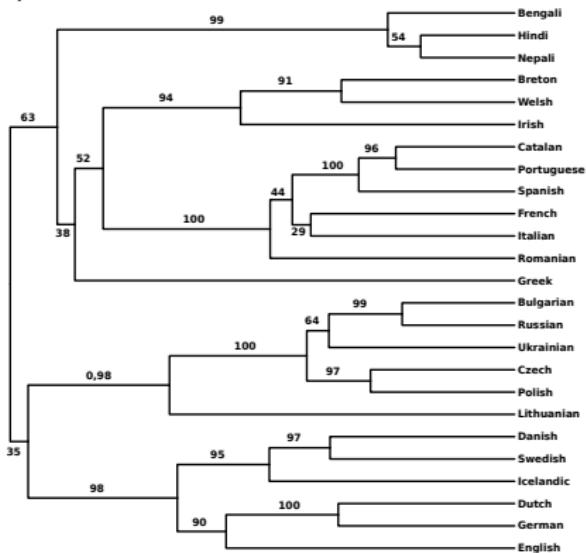
# Running example

sample entries:

<i>language</i>	<i>phonological form (IELex)</i>	<i>cognate class (IELex)</i>	<i>order of subject, object and verb (WALS)</i>
Bengali	-	-	SOV
Breton	-	-	SVO
Bulgarian	mu're	sea:B	SVO
Catalan	mar; mar; ma	sea:B	SVO
Czech	'mɔře	sea:B	SVO
Danish	haw/sø?	sea:K/sea:J	SVO
Dutch	ze	sea:J	no dominant order
English	si:	sea:J	SVO
French	mer	sea:B	SVO
German	ze:/o:tsea:n/me:g	sea:J/sea:E/sea:B	no dominant order
Greek	'θala,sa	sea:F	no dominant order
Hindi	-	-	SOV
Icelandic	ha:v/sjou:r	sea:K/sea:J	SVO
Irish	'fær'ji	sea:G	VSO
Italian	'mare	sea:B	SVO
Lithuanian	'ju:re	sea:H	SVO
Nepali	-	-	SOV
Polish	'mɔʐɛ	sea:B	SVO
Portuguese	mar	sea:B	SVO
Romanian	'mare	sea:B	SVO
Russian	'mɔrl̩	sea:B	SVO
Spanish	mar	sea:B	SVO
Swedish	ha:v/þø:	sea:K/sea:J	SVO
Ukrainian	'mɔře	sea:B	SVO
Welsh	-	-	VSO

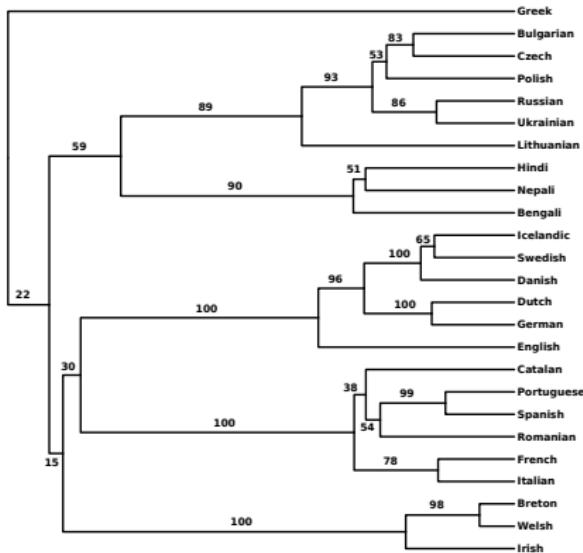
# Automatic phylogenetic inference

phonetic characters

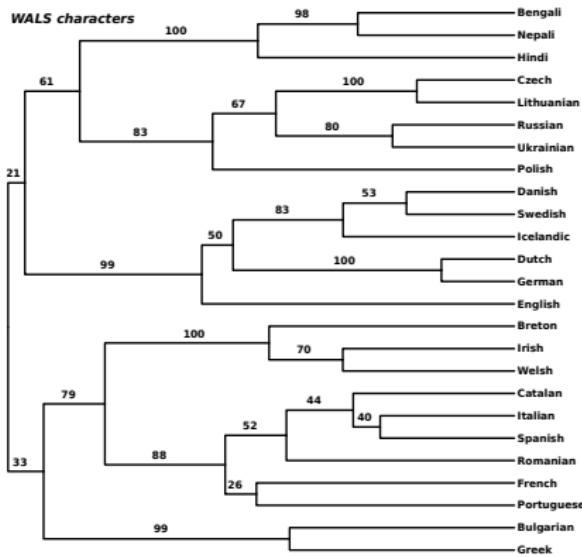


# Automatic phylogenetic inference

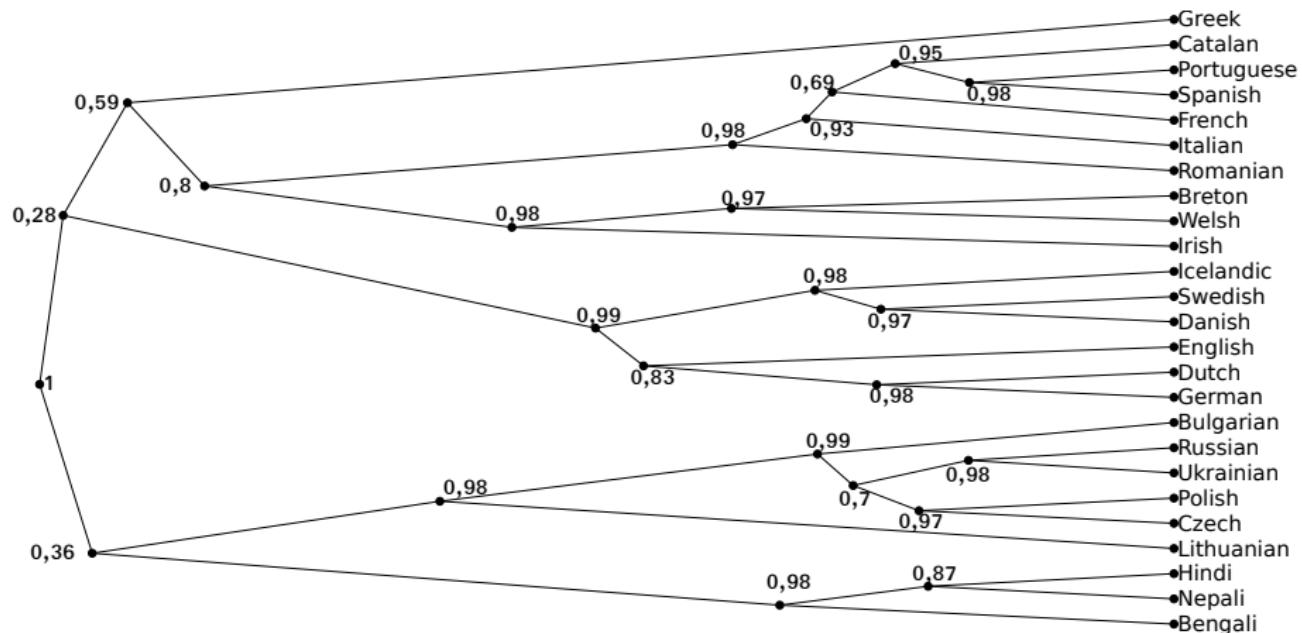
cognacy characters



# Automatic phylogenetic inference



# Automatic phylogenetic inference



- Bouchard-Côté, A., D. Hall, T. L. Griffiths, and D. Klein (2013). Automated reconstruction of ancient languages using probabilistic models of sound change. *Proceedings of the National Academy of Sciences*, **36**(2):141–150.
- Brown, C. H., E. Holman, and S. Wichmann (2013). Sound correspondences in the world's languages. *Language*, **89**(1):4–29.
- Dellert, J. (2015). Compiling the Uralic dataset for NorthEraLex, a lexicostatistical database of Northern Eurasia. Proceedings of the First International Workshop on Computational Linguistics for Uralic Languages. January 16, Tromsø, Norway.
- Dyen, I., J. B. Kruskal, and P. Black (1992). An Indoeuropean classification: A lexicostatistical experiment. *Transactions of the American Philosophical Society*, **82**(5):1–132.
- Hruschka, D. J., S. Branford, E. D. Smitsch, J. Wilkins, A. Meade, M. Pagel, and T. Bhattachary (2015). Detecting regular sound changes in linguistics as events of concerted evolution. *Current Biology*, **25**(1):1–9.

- List, J.-M. (2014). *Sequence Comparison in Historical Linguistics*. Düsseldorf University Press, Düsseldorf.
- List, J.-M. (2016). Beyond cognacy: historical relations between words and their implication for phylogenetic reconstruction. *Journal of Language Evolution*, 1(1):119–136. Doi: 10.1093/jole/lzw006.
- Mennecier, P., J. Nerbonne, E. Heyer, and F. Manni (2016). A Central Asian language survey: Collecting data, measuring relatedness and detecting loans. *Language Dynamics and Change*, 6(1). In press.
- Swadesh, M. (1955). Towards greater accuracy in lexicostatistic dating. *International Journal of American Linguistics*, 21:121–137.
- Swadesh, M. (1971). *The Origin and Diversification of Language*. Aldine, Chicago.
- Wichmann, S. and E. W. Holman (2013). Languages with longer words have more lexical change. In L. Borin and A. Saxena, eds., *Approaches to Measuring Linguistic Differences*, pp. 249–284. Mouton de Gruyter, Berlin.