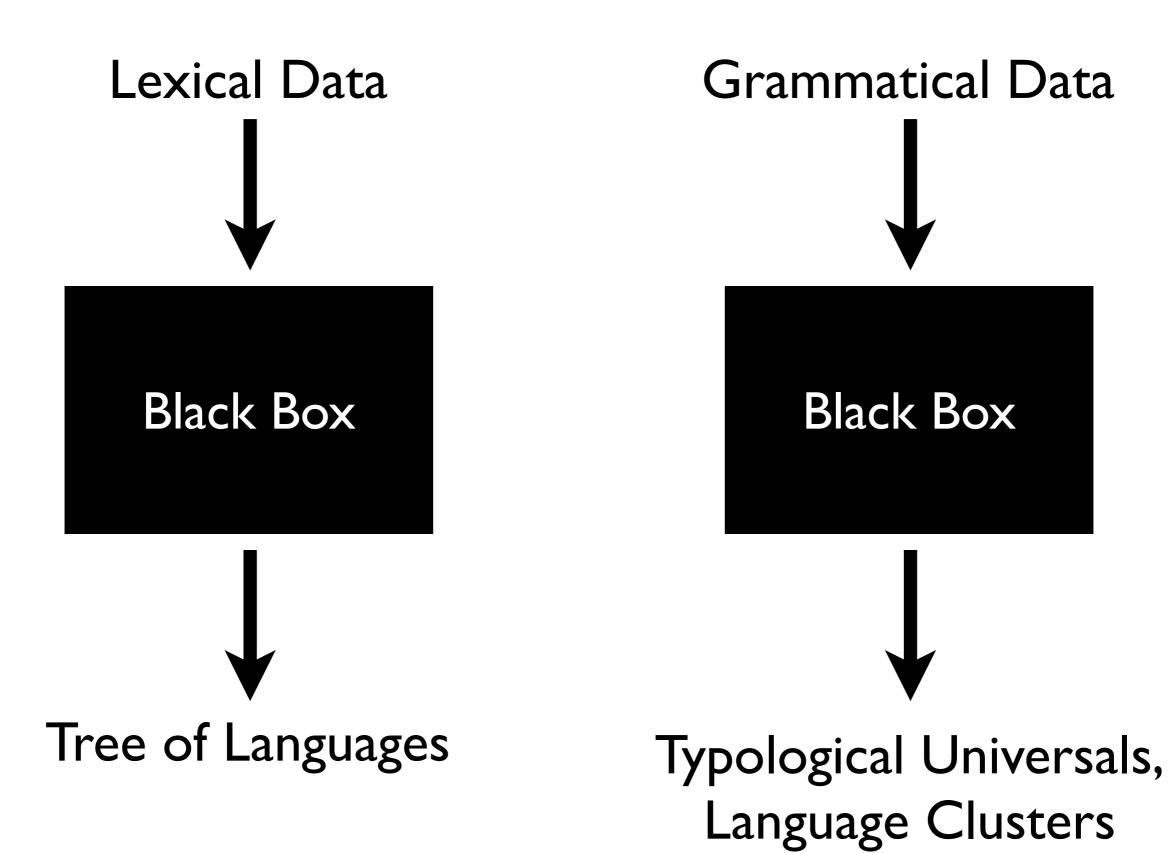
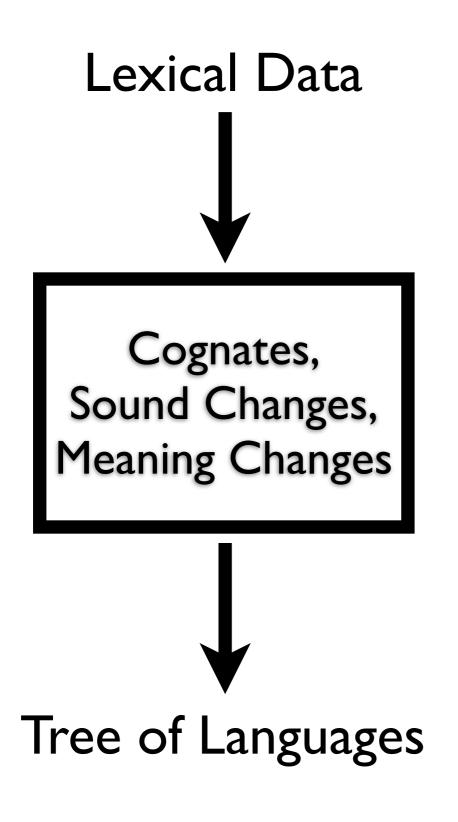
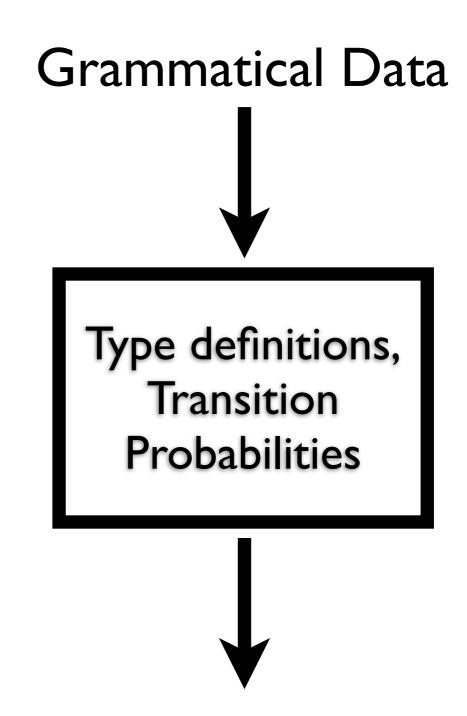
# Beyond the black box A plea for explicit models of language change

Michael Cysouw
Ludwig Maximilians University Munich

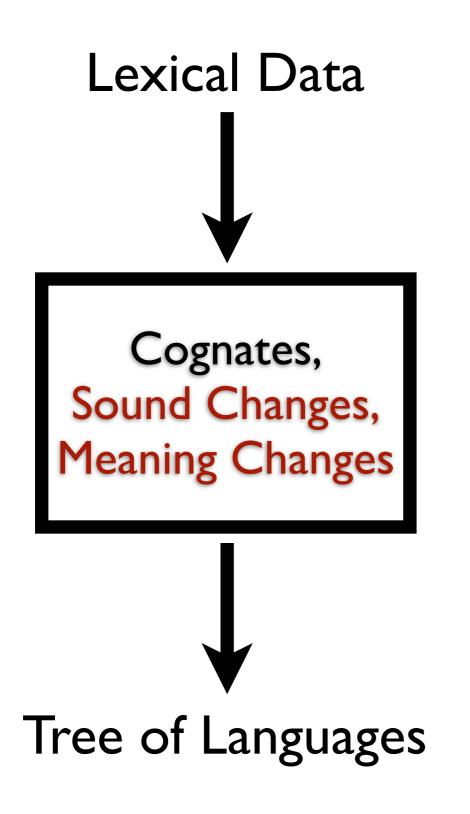
## Data Black Box (using aggregated data) Result

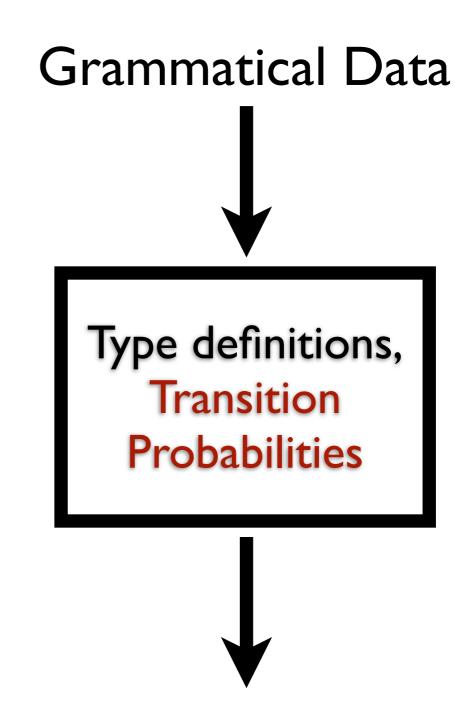






Typological Universals, Language Clusters

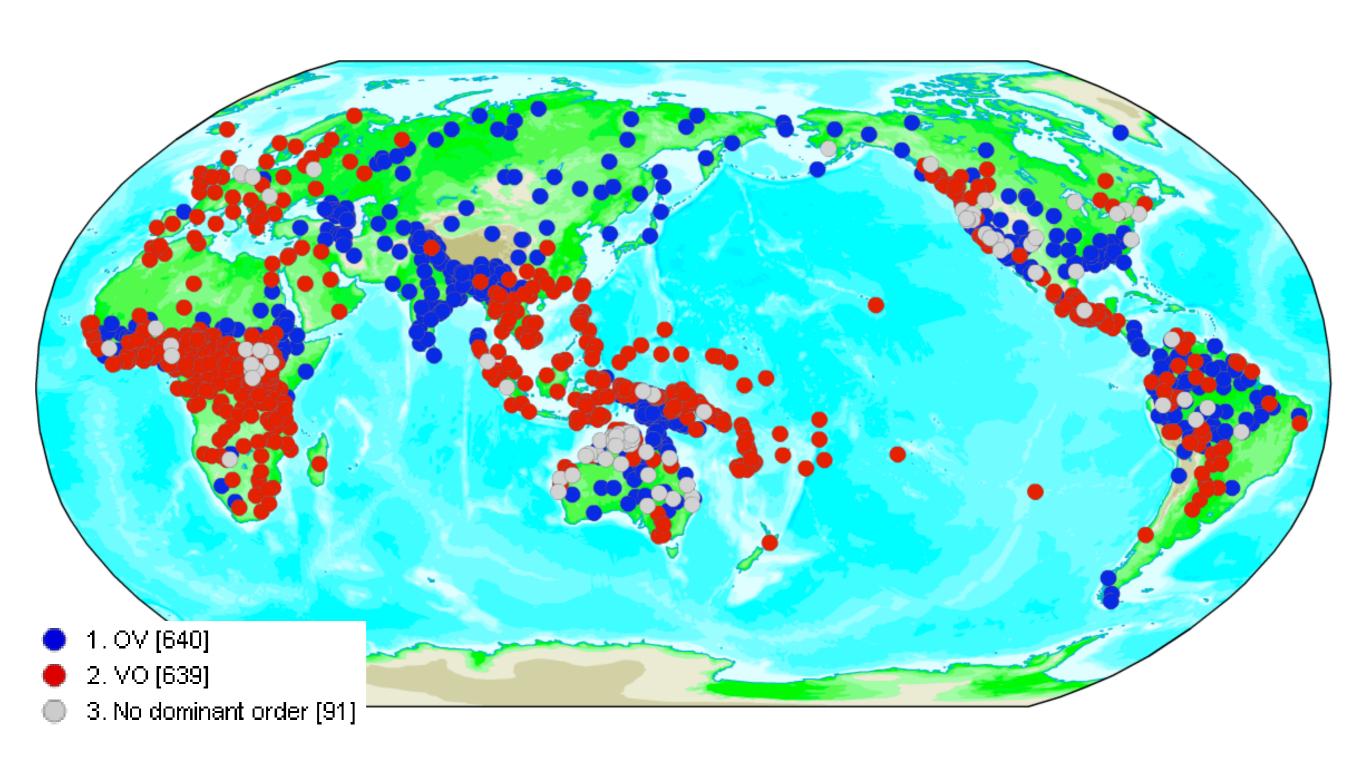




Typological Universals, Language Clusters

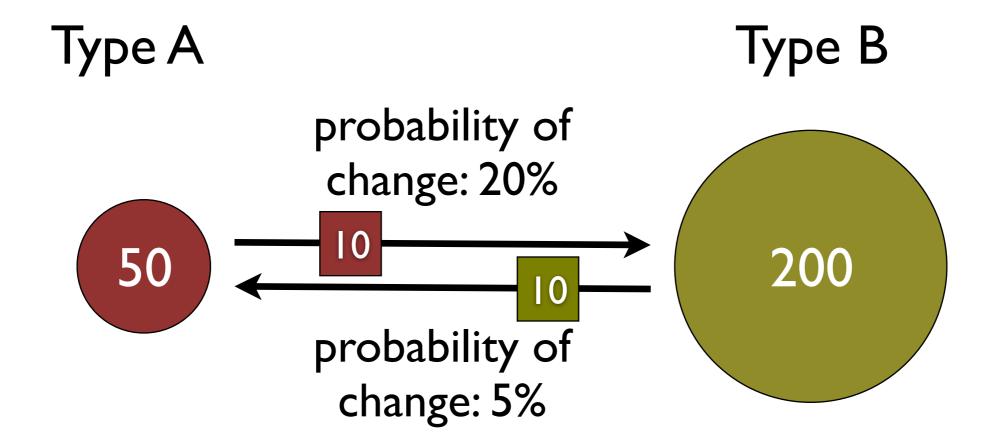
### Grammatical Data

### Order of Object and Verb

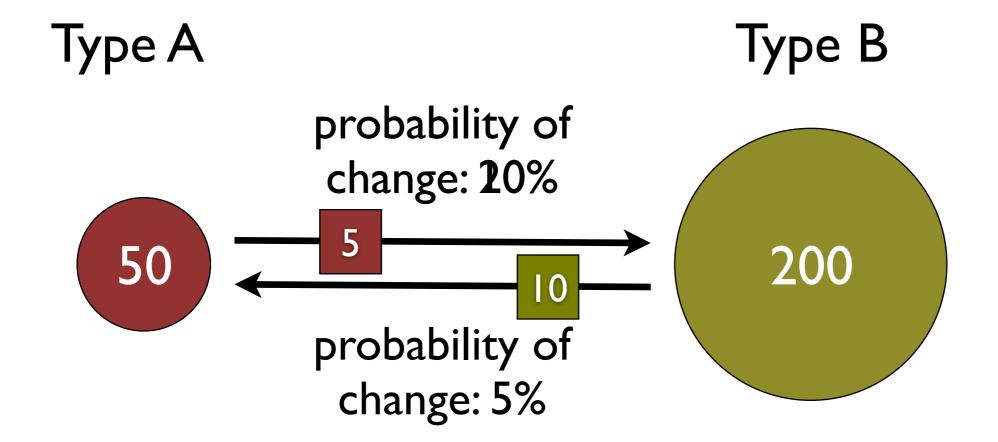


### Dynamic Typology

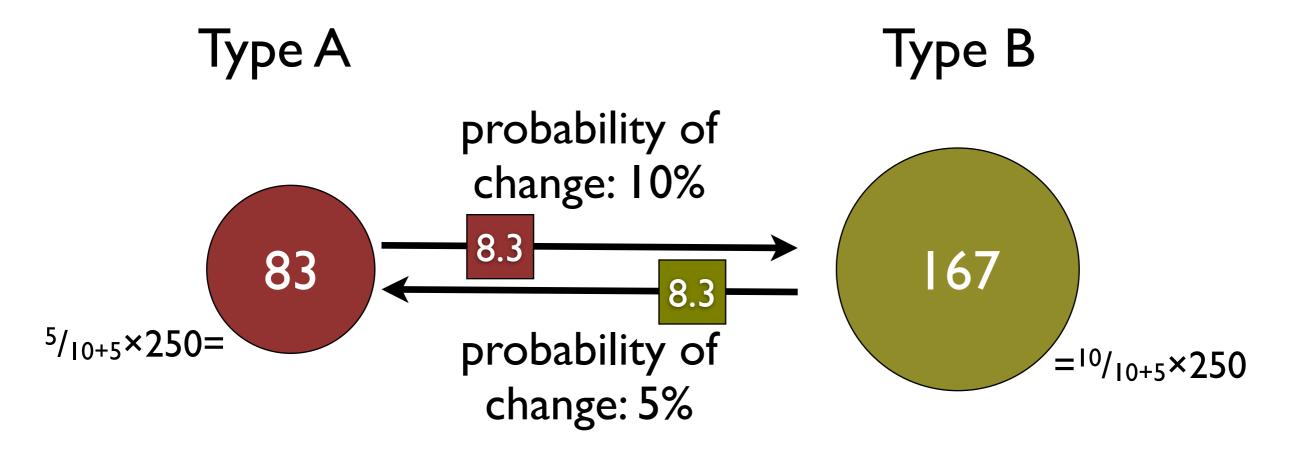
- It is not the actual frequencies that matter
- It is the stable distribution that matters
- A stable distribution is a situation in which just as many languages change from A to B as change from B to A.
- The extent to which the actual is different from the stable situation signals an effect of history



Stable distribution



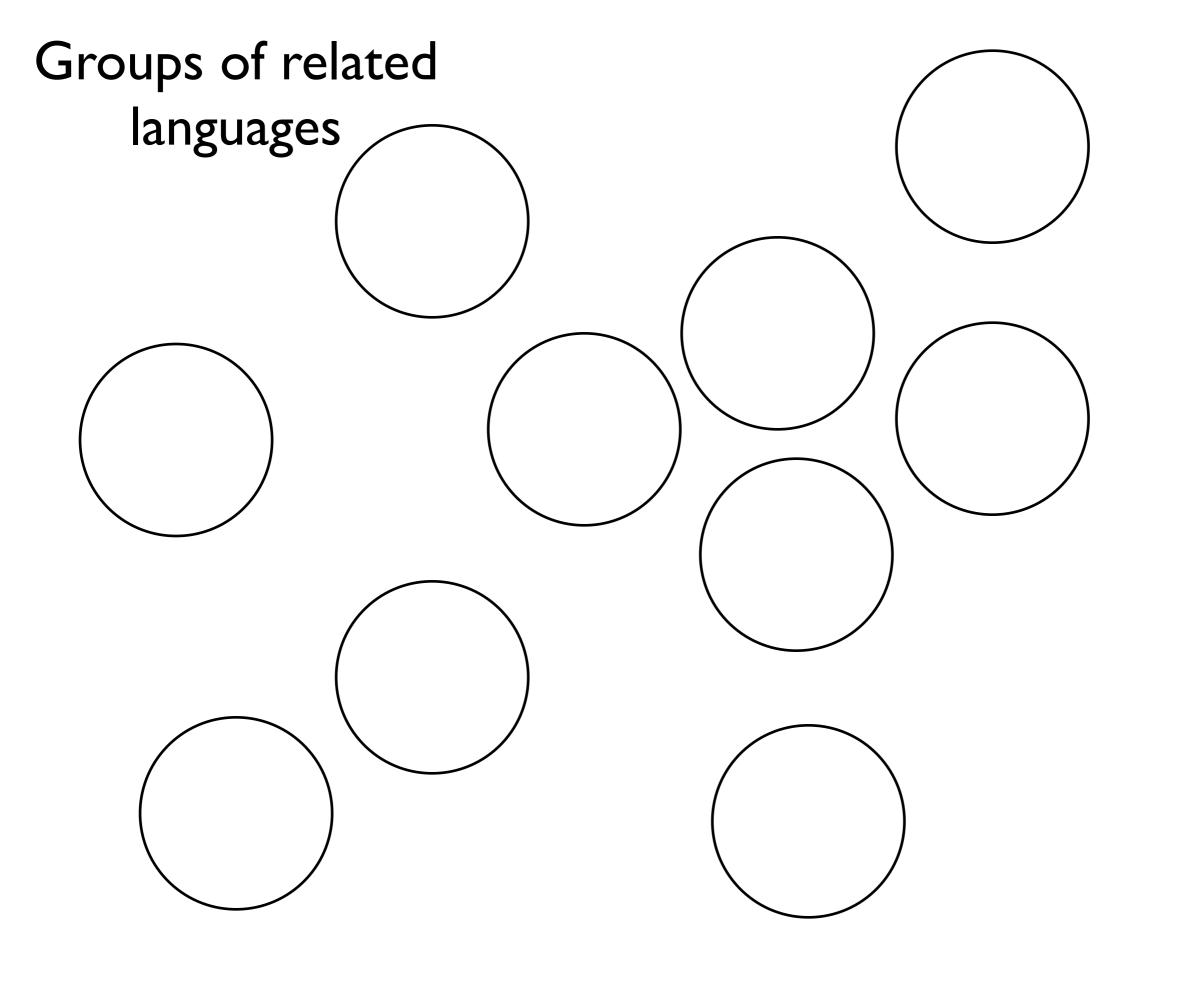
Instable distribution

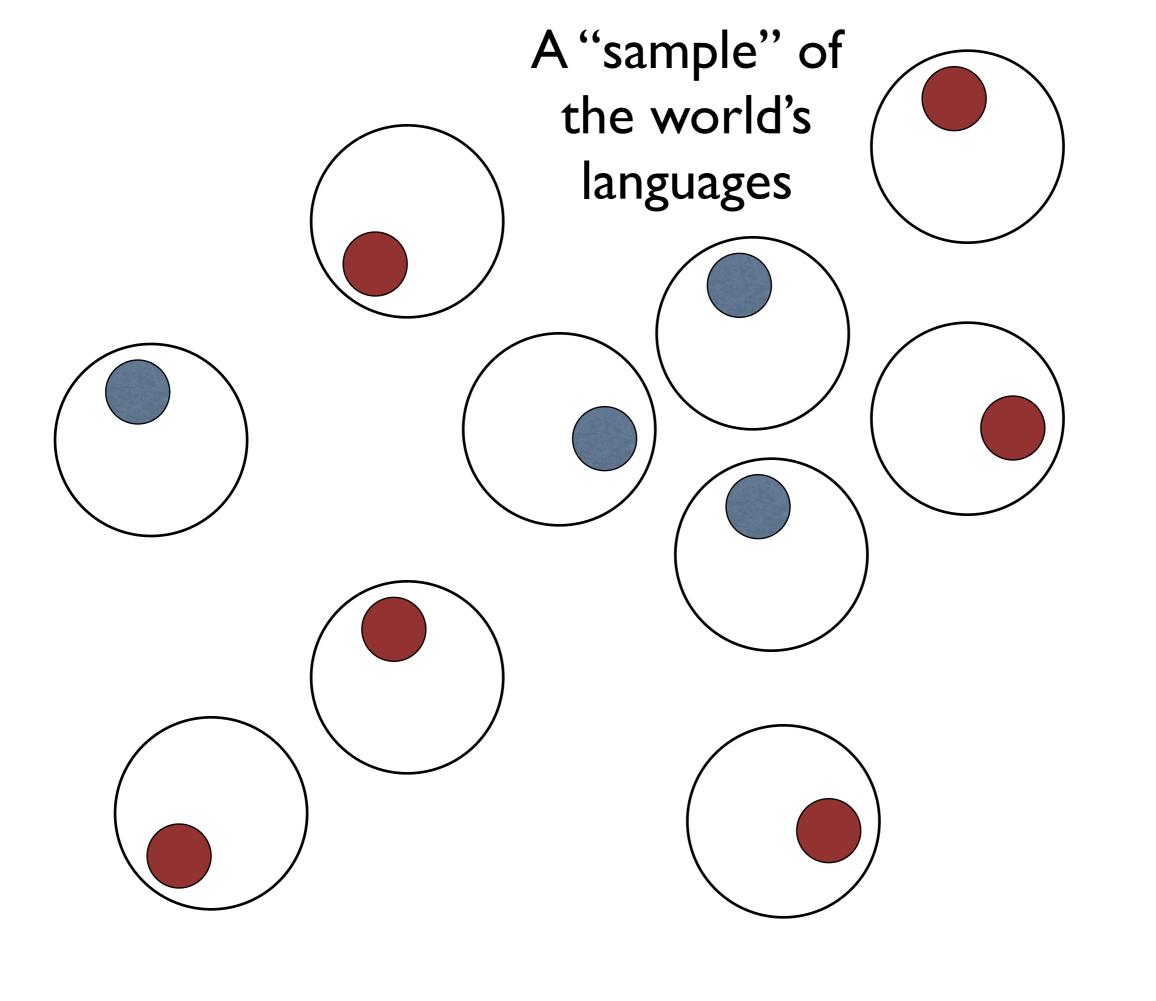


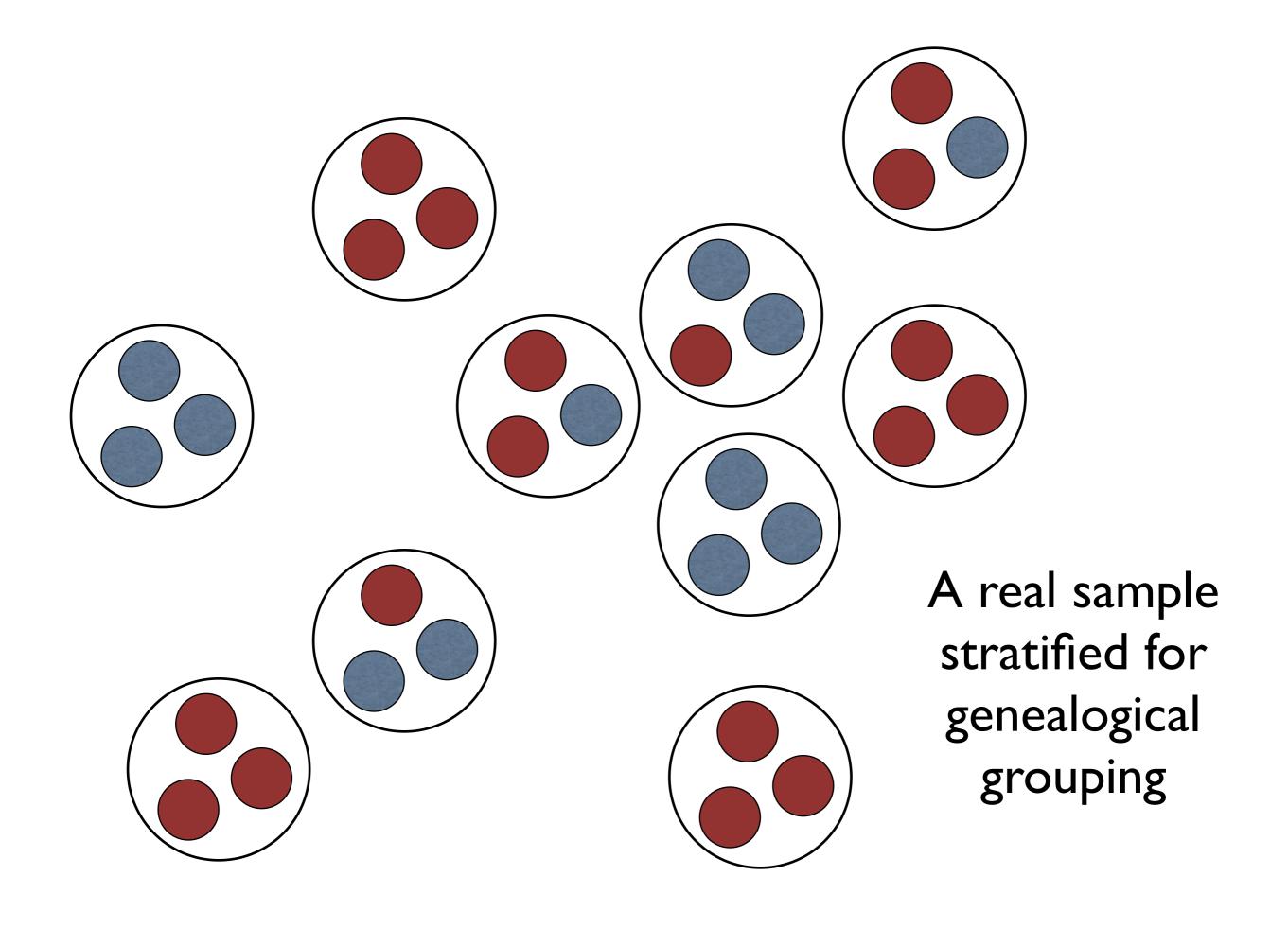
Expected stable distribution

### Estimating Transition Probabilities

- Are transitions probabilities measurable?
- If yes:
   use group internal variation of groups







#### Elena Maslova's proposal

probability of   
**any** change 
$$= \alpha \cdot \text{frequency (blue)} + \beta$$
  
happening

For groups of three languages:

$$\alpha = 3 \cdot (p_{\text{blue} \rightarrow \text{red}} - p_{\text{red} \rightarrow \text{blue}})$$

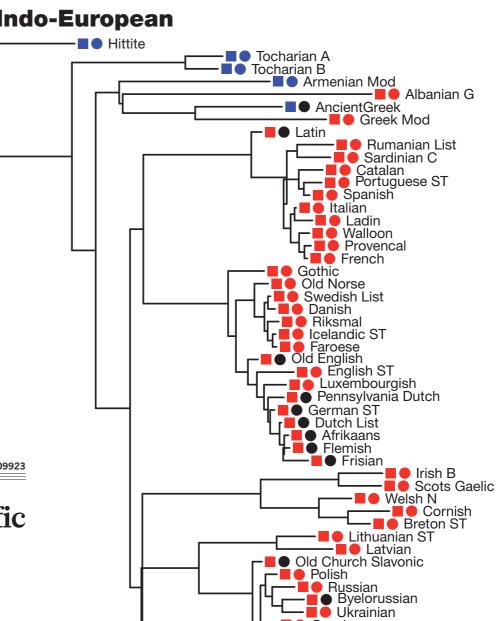
$$\beta = 3 \cdot p_{\text{red} \rightarrow \text{blue}} \cdot (1 - p_{\text{blue} \rightarrow \text{red}})$$



### Evolved structure of language shows lineage-specific trends in word-order universals

Michael Dunn $^{1,2}$ , Simon J. Greenhill $^{3,4}$ , Stephen C. Levinson $^{1,2}$  & Russell D. Gray  $^3$ 

#### **Indo-European**



Czech Slovak Lusatian L Lusatian U

-■● Slovenian Serbocroatian Bulgarian Macedonian

Kurdish

Kashmiri

- Hindi

Nepali List Bihari Bengali - Oriya

Persian List Tadzik

Afghan Waziri

■ Wakhi

Singhalese

— ■ Marathi • Gujarati

- ■ ● Urdu — ■ ● Panjabi ST — ■ ● Lahdna

Ossetic

Assamese

Sindhi

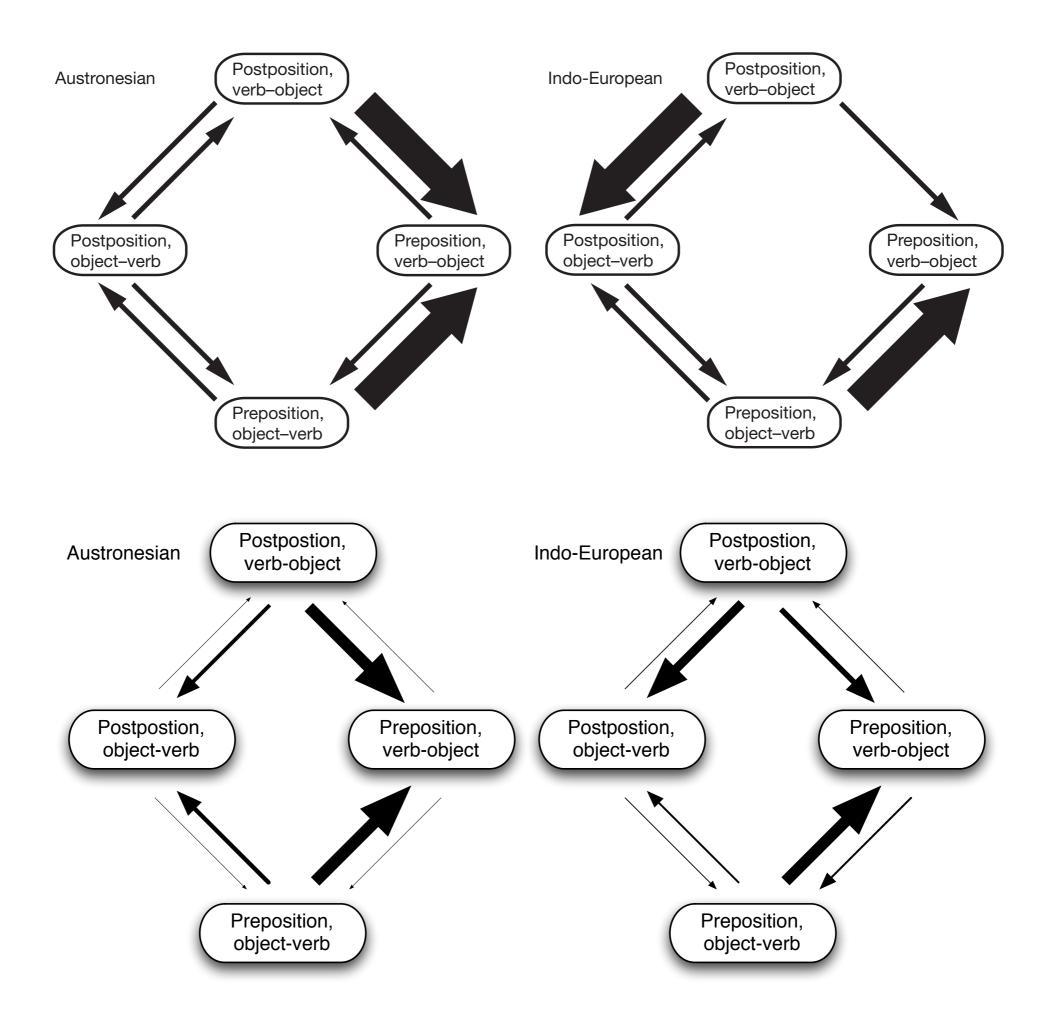
- Marwari

#### ETTER

doi:10.1038/nature09923

#### Evolved structure of language shows lineage-specific trends in word-order universals

Michael Dunn<sup>1,2</sup>, Simon J. Greenhill<sup>3,4</sup>, Stephen C. Levinson<sup>1,2</sup> & Russell D. Gray<sup>3</sup>



## Peeking inside the typological black box

- Typological parameters are not static, it is actually possible to approach them dynamically
- The real scholarly debate should be about the validity of estimates of transition probabilities

### Lexical Data

## What is the goal of lexical comparison?

- Producing new trees or other classifications is only of limited interest
- There are only two possible reactions:
  - "We knew that all along"
  - "That tree is wrong"
- More productive are explicit proposals of
  - cognacy
  - sound change
  - meaning change

## What is the goal of lexical comparison?

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  - cognacy
  - sound change
  - meaning change

### Modeling Sound Similarities

- Manually specified (Kondrak 2002; Heeringa 2004)
- Hidden Markov Models (Ristad & Yianilos 1997; Bhargava & Kondrak 2009)
- Regular multi-alignment (Prokić 2010; Steiner, Stadler & Cysouw 2011)
- Bayesian inference (Prokić 2010)
- Investigating almost identical words (Holman, Brown & Wichmann 2011)

### Graphemic Normalization

- Widespread idea:
   "Convert everything into IPA"
- IPA is just another orthography!
   (only approximation of sound)
- Still: sound-based normalization is practical (but there are strong differences!)
- But: can we do without ?

### Graphemic parsing

Unicode normalization

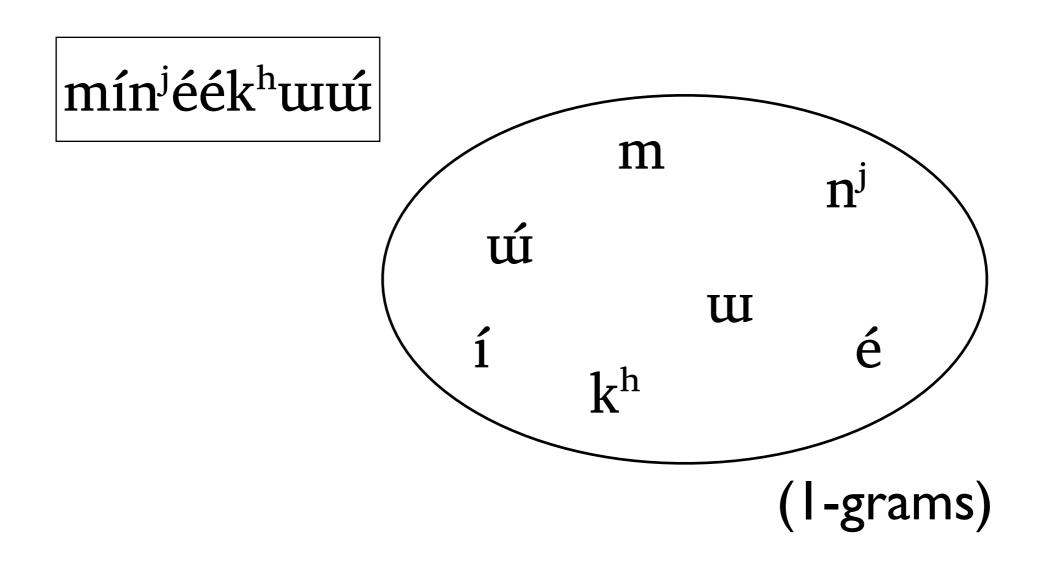
ố vs. o ~ ′

- Orthographic parsing (separate orthographic units as used in the source: "graphemes")
- Orthographic normalization (research specific!)

### Graphemic parsing

- Code points (7) t s h o ~ :
- Characters (4)  $t s^h \tilde{o}$ :
- Graphemes (2)  $ts^h \hat{o}$ :

### 'bag of symbol" approach



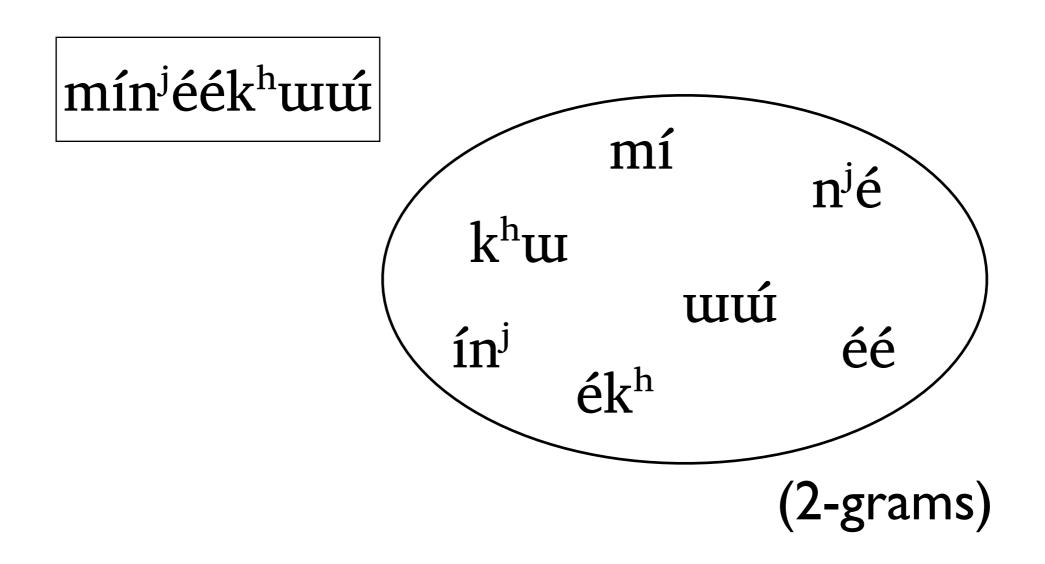
	Bora	Muinane
down	tʃín <sup>j</sup> e, paári	báari, gíino
bee	íímɯ́?óexpʰi, té?tsʰipa	n <del>íí</del> biri, m <del>íi</del> biri?i
sharp	tsʰúʔxɨβáne	s <del>í</del> íxéβano
• • •	• • •	• • •

0.0 0.2 0.4 0.6 0.8 1.0 dice coefficient

### Cross-script mapping

Е	R	freq	dice
r	p	184	0.88874745
n	Н	115	0.8461936
1	Л	104	0.79646295
S	c	114	0.7927922
t	Т	165	0.7701921
m	M	47	0.7699933
О	О	184	0.7510106
k	ТЬ	21	0.74458015
p	П	50	0.7388723
i	И	102	0.7034591
a	a	221	0.6866478
u	У	40	0.6449104
c	К	77	0.6251676
e	e	219	0.59066784
b	б	32	0.525643
w	В	46	0.46787763
d	Д	42	0.381996
:	:	÷	:

### 'bag of symbol" approach



Bora	Muinane	Bora	Muinane	Bora	Muinane
#k	$\#k^h$	#i	#i	#n	#n
ki	$k^h$ $\mathbf{w}$	#a	#a	#m	#m
se	ts <sup>h</sup> i	di	ti	mɨ	mw
xe	хi	du	to	ni	nw
ga	k <sup>w</sup> a	#d	#t	us	ts <sup>h</sup> i
ba	pa	#s	#ts <sup>h</sup>	#t	#t <sup>h</sup>
#b	#p	gi	tʃi	ig	шk <sup>w</sup>
e#	<b>i</b> #	ni	ni	#ф	$\#p^h$

### Using bigram matching

Bora 'two': mín<sup>j</sup>éék<sup>h</sup>ww

Muinane 'two': míínoki

	#m	mi	ii	in	no	ok	k <del>i</del>	<del>i</del> #
#m	22	3	2	2	2	2	2	2
mi	4	12	2	2	5	_	_	I
in <sup>j</sup>	2	_	5	9	3	_	_	2
n <sup>j</sup> e	_	I	5	5	4	_	_	2
ee	3	3	3	3	6	2	2	2
ek <sup>h</sup>	_	2	_	_	4	2	3	2
k <sup>h</sup> w	2	2	2	2	2	_	23	2
шш	2	2	3	3	2	2	4	4
w#	2	2	3	2	3	I	3	4

	#m	mi	ii	in	no	ok	k <del>i</del>	<del>i</del> #
#m	22	3	2	2	2	2	2	2
mi	4	12	2	2	5	I	_	I
in <sup>j</sup>	2	I	5	9	3	I	_	2
n <sup>j</sup> e	_	Ι	5	5	4	-	_	2
ee	3	3	3	3	6	2	2	2
ek <sup>h</sup>	_	2	_	_	4	2	3	2
k <sup>h</sup> w	2	2	2	2	2	Ι	23	2
шш	2	2	3	3	2	2	4	4
w#	2	2	3	2	3	I	3	4

	Bora	Muinane
down	tʃín <sup>j</sup> e, paári	báari, gíino
bee	íímɯ́?óexpʰi, té?tsʰipa	n <del>íí</del> biri, m <del>íi</del> biri?i
sharp	tsʰúʔxɨβáne	s <del>í</del> íxéβano
• • •	• • •	• • •

	Bora	Muinane
down	t∫ín <sup>j</sup> e, <b>paári</b>	<b>báari</b> , gíino
bee	íímɯ́?óexpʰi, té?tsʰipa	n <del>íí</del> biri, m <del>íi</del> biri?i
sharp	tsʰẃ?xɨβáne	s <del>í</del> ixéβano
• • •	• • •	• • •

#### Inside the lexical black box

- Grapheme correspondences are relatively easy to approximate
- Use them to propose hypotheses about cognacy and sound correspondences
- Cognacy and sound correspondences can be fruitfully discussed