

## What is phylogenetic signal?

**Phylogenetic signal** is a measure of statistical dependencies among traits due to phylogenetic relationships (Revell et al. 2008).

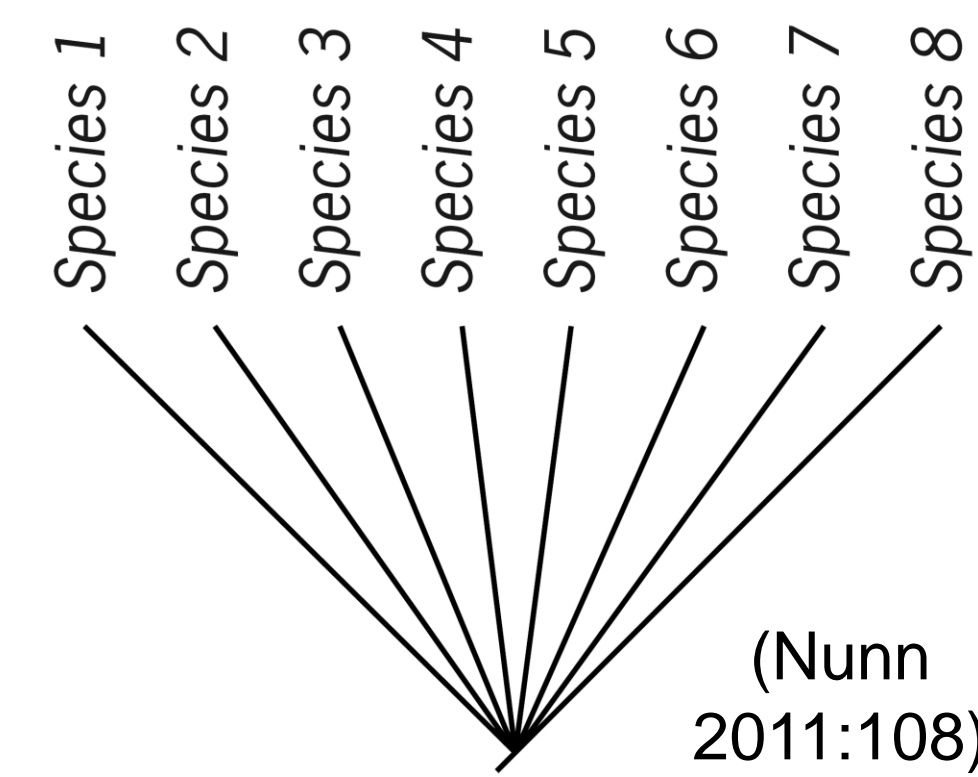
**Research questions:** (1) *How well do the phoneme inventories and the phonotactics of Tai languages fit a phylogenetic tree?*  
(2) *Would phonological data be useful for quantitative historical linguistics? (e.g. subgrouping, ancestral state reconstruction)*

**What's the intuition?** The more closely related two languages are, the more similar their phoneme inventories and phonotactic profiles will be (with usual caveats for coincidence and borrowing).

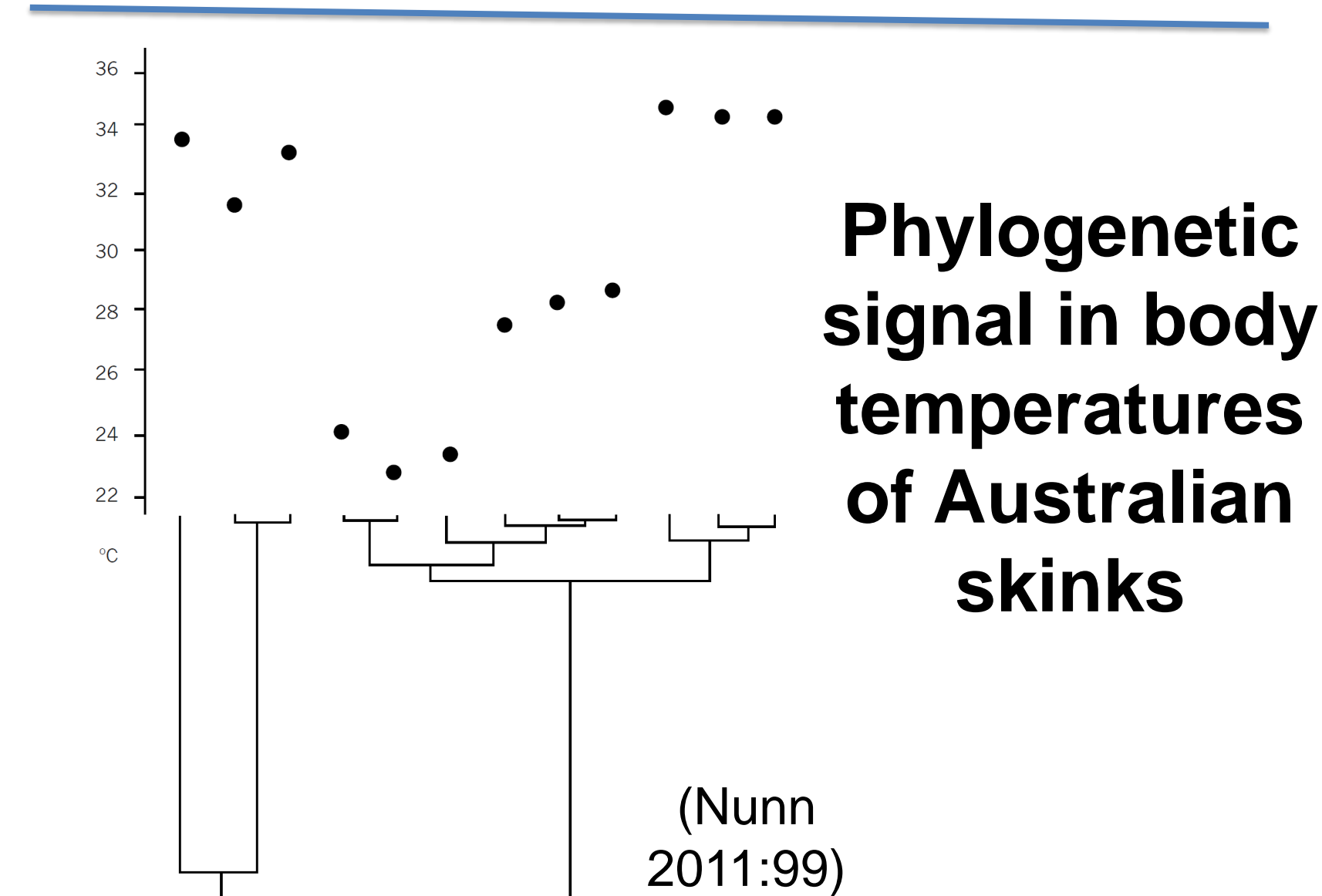
**What do we gain by using computational phylogenetics?**

- Lets us examine descent in new kinds of traits, and answer questions that may not be tractable with traditional methods
- Replicable and less subjectivity than the comparative method
- To date, lexical cognacy data has most often been used in linguistics (e.g. Gray, Bryant and Greenhill 2010)
- Work on phylogeny in sound systems is quite new (Macklin-Cordes 2015, Macklin-Cordes & Round 2016)

**Tree with no phylogenetic signal**



(Nunn 2011:108)

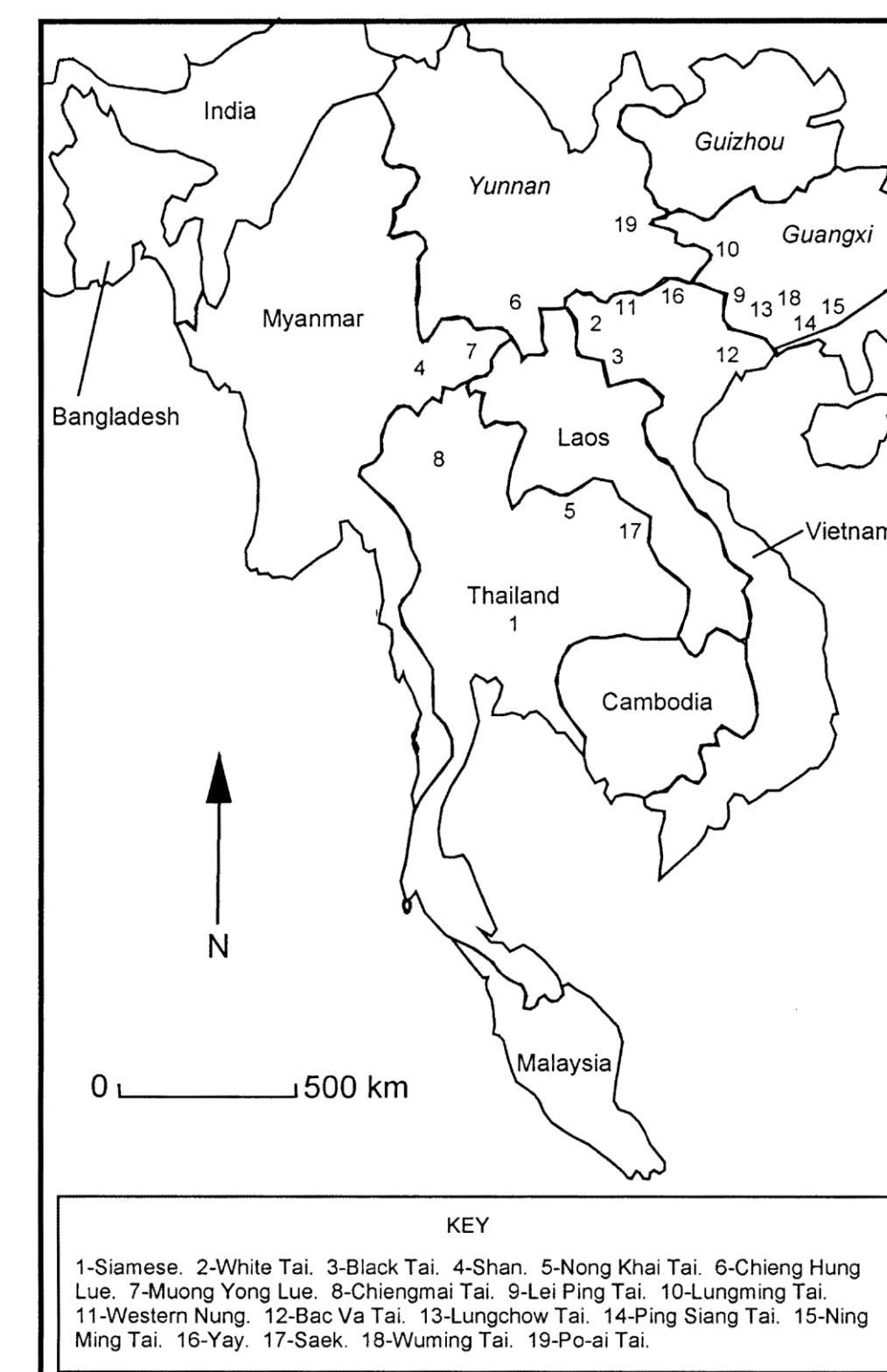
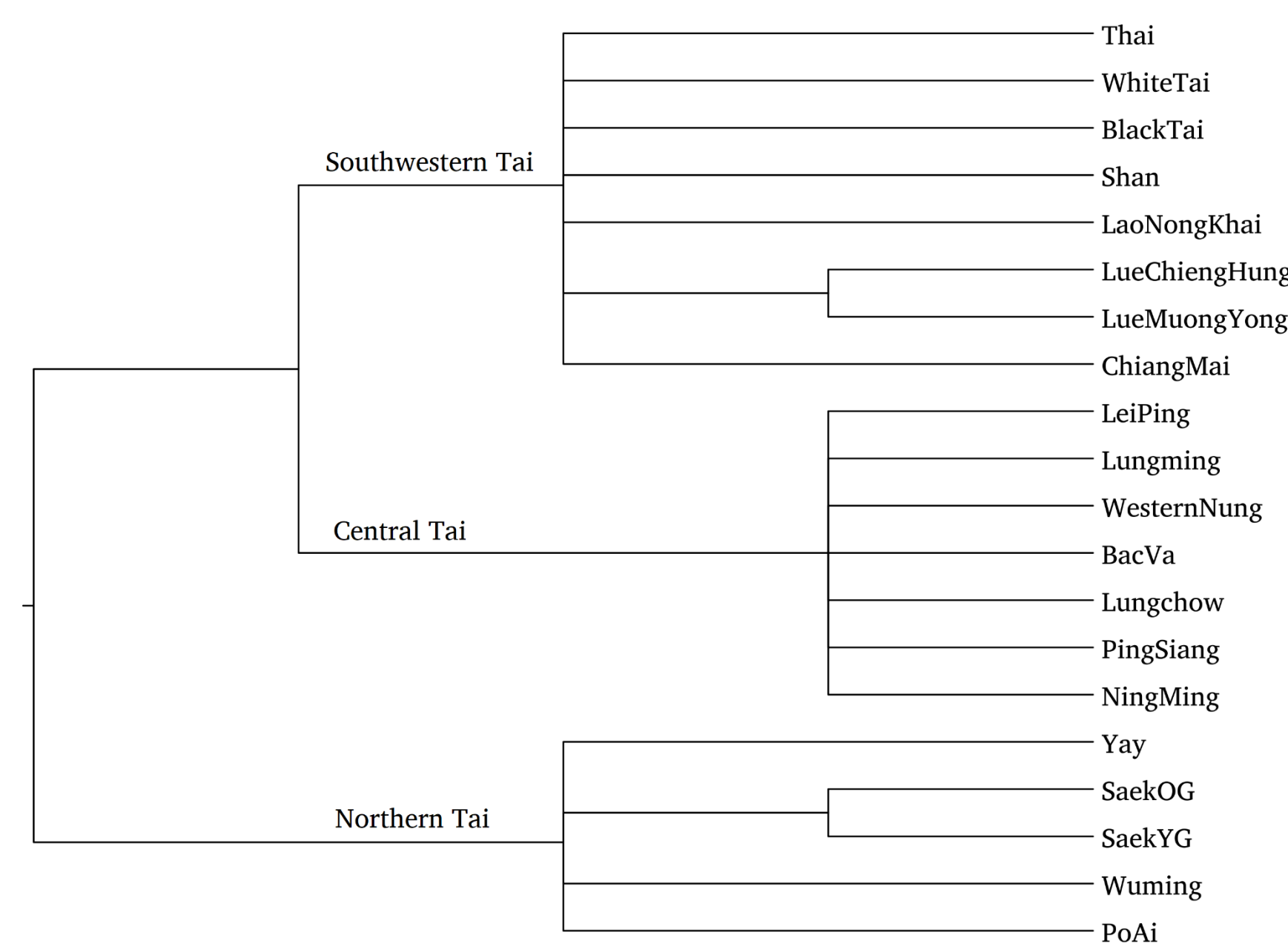


**Phylogenetic signal in body temperatures of Australian skinks**

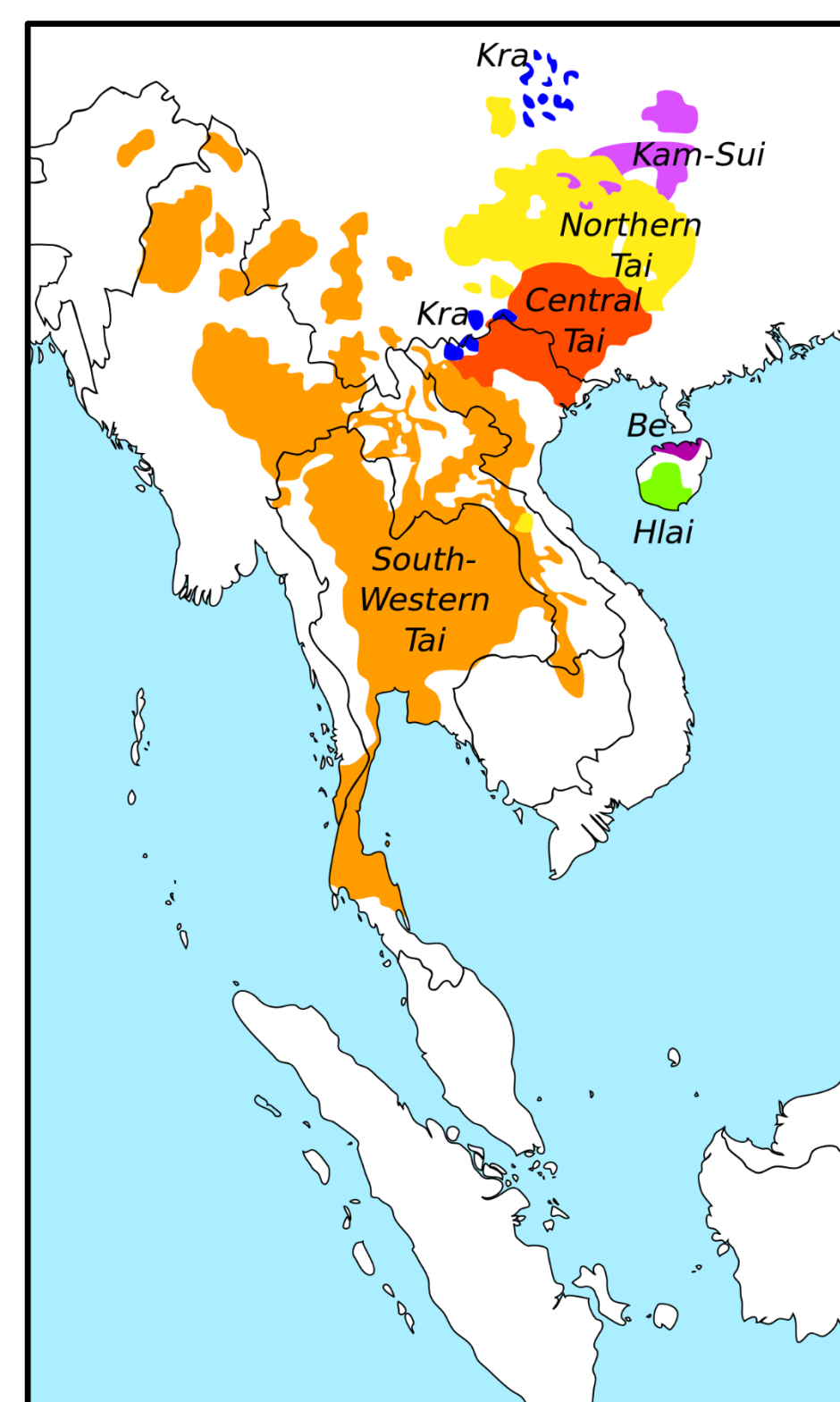
(Nunn 2011:99)

## Background on Tai languages

**1159 cognate sets from 20 Tai lects used in this study:**



**Tai lect locations**  
(Hudak 2008)



**Kra-Dai language distribution**  
(Wikimedia Commons)

“Classic” comparative method tree of Tai lects used in this study (adapted from Chamberlain 1975)

## Statistical tests for phylogenetic signal

**Method:**

- Two tests for phylogenetic signal (*D* test and Blomberg's *K*)
- Applied to two types of phonological data (phonemes and biphones)

**Different tests exist for different data types**

**Discrete data (binary and/or multistate)**

- D* test (Fritz & Purvis 2010)
- $\delta$  (Holland et al. 2002)
- Mean *Q*-residual (Gray et al. 2004)

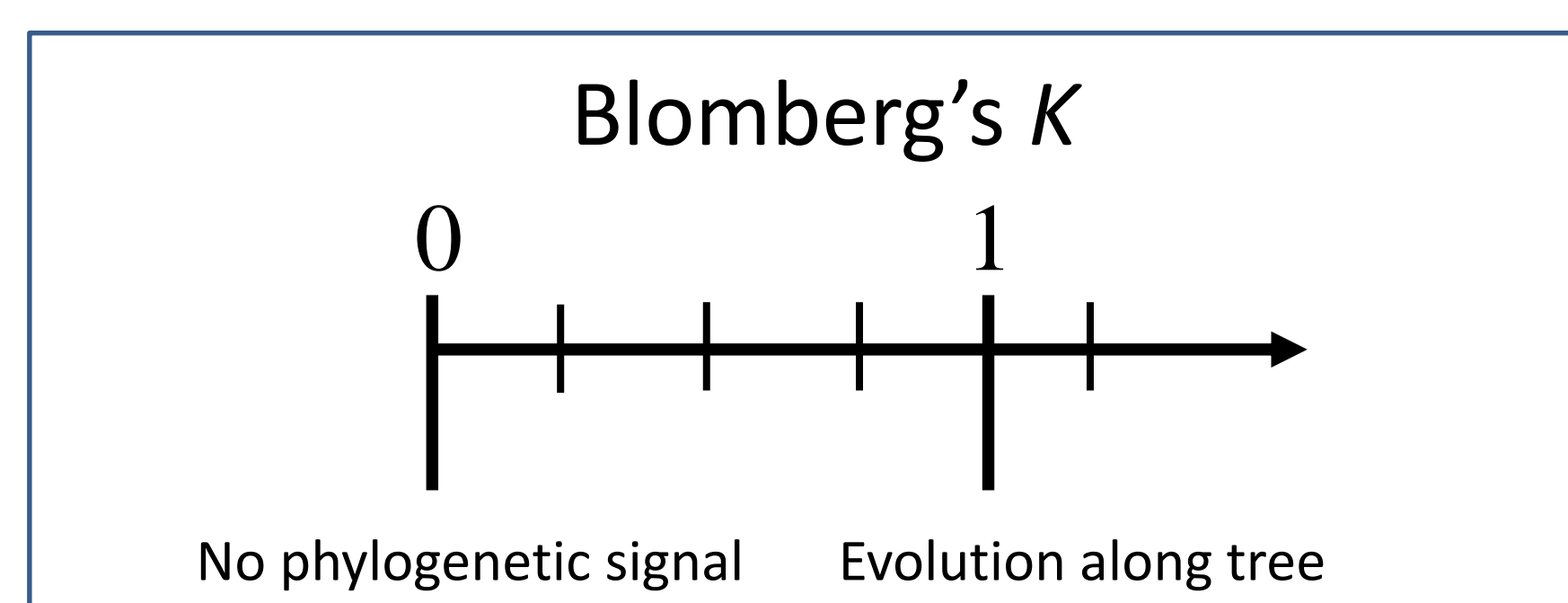
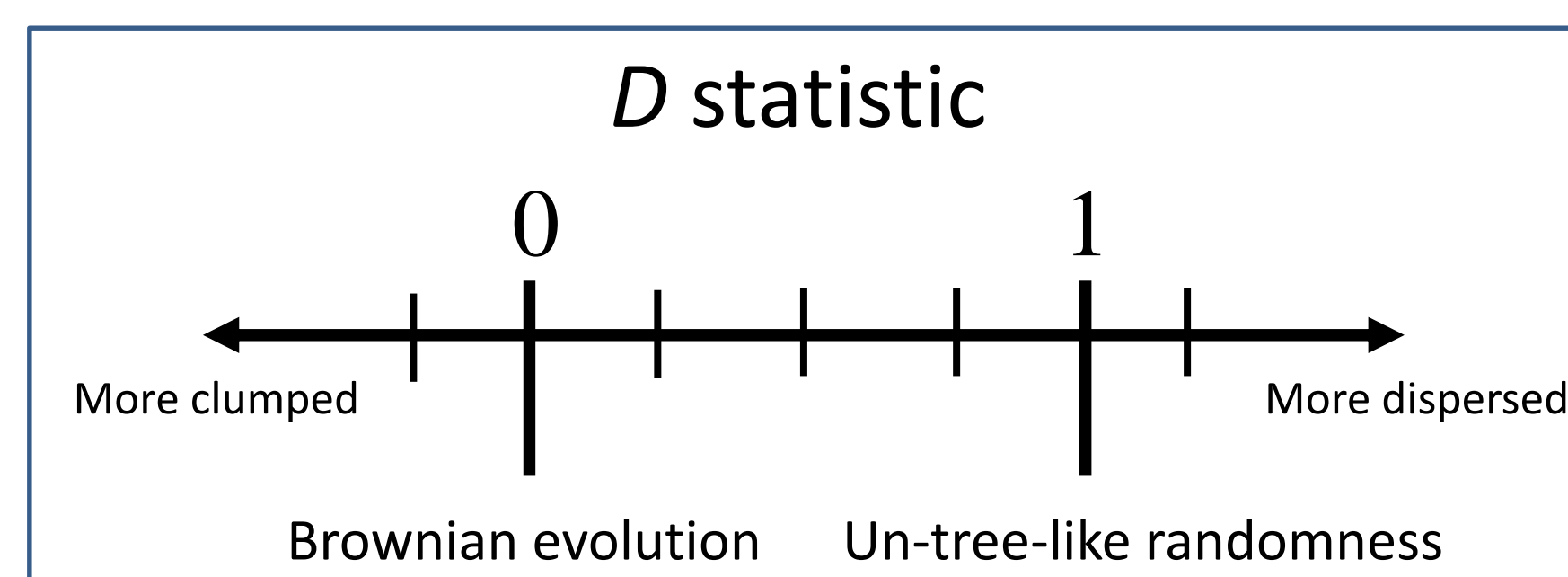
**Continuous data**

- K* (Blomberg, Garland & Ives 2003)
- Cmean (Abouheif 1999)

**Among others!**

**Brownian evolution:** model of evolutionary change with randomly fluctuating selection; aka “neutral evolution”

**What do the scores mean?**



(Macklin-Cordes and Round 2016)

## Data

**Two types of data extracted with Python scripts from 1159 cognate sets:**

- Binary data (“coarse-grained” phonological data)
    - Phoneme presence/absence
    - Biphoneme presence/absence
  - Continuous data (“high-definition” phonological data)
    - Phoneme frequency (calculated as the quotient of total lexical items, as opposed to total phones)
    - Biphoneme Markov chain transition probability ( $P_{ij} = P(x_{n+1} = j | x_n = i)$ ) (Ching & Ng 2006)
- Traits with no variation are pruned; phylogenetically uninformative, and some tests require their removal

**Variation in Tai phoneme data**

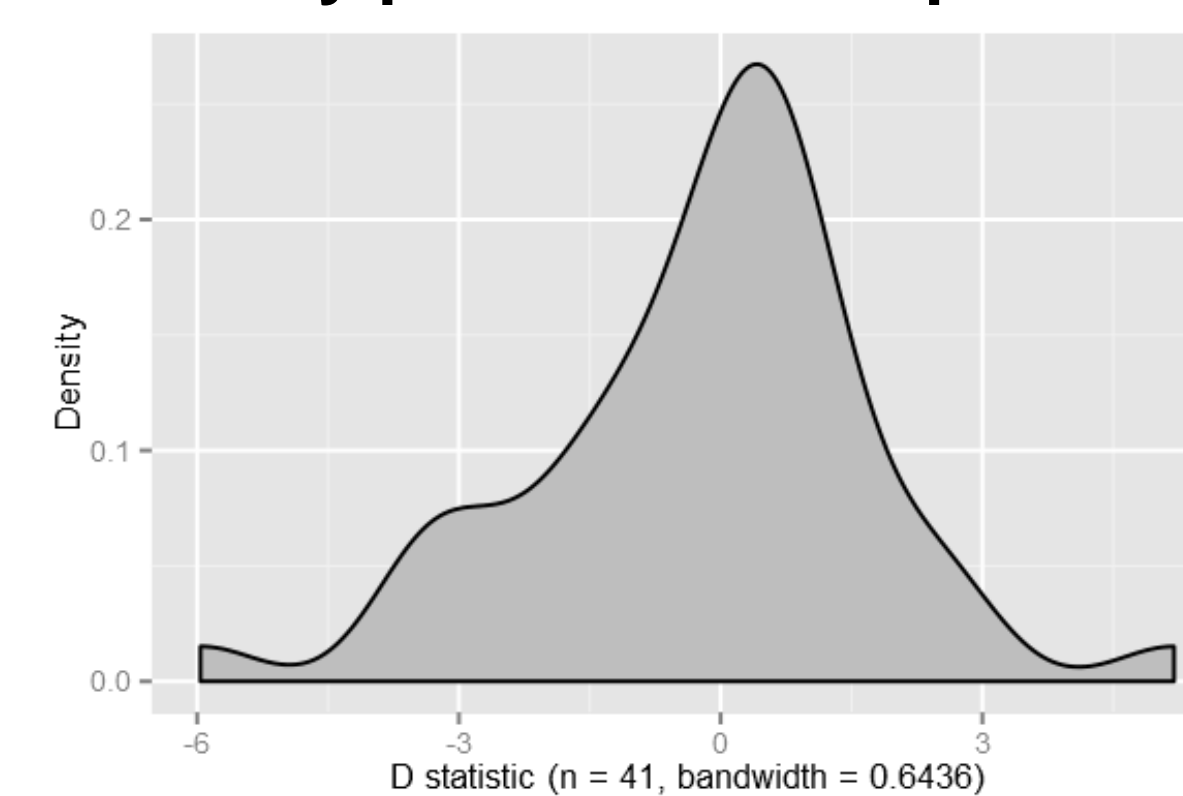
Lects	Phonemes	
	Total	w/Variation
20	54	41

**Variation in Tai biphoneme data**

Lects	Biphones	
	Total	w/Variation
20	555	526

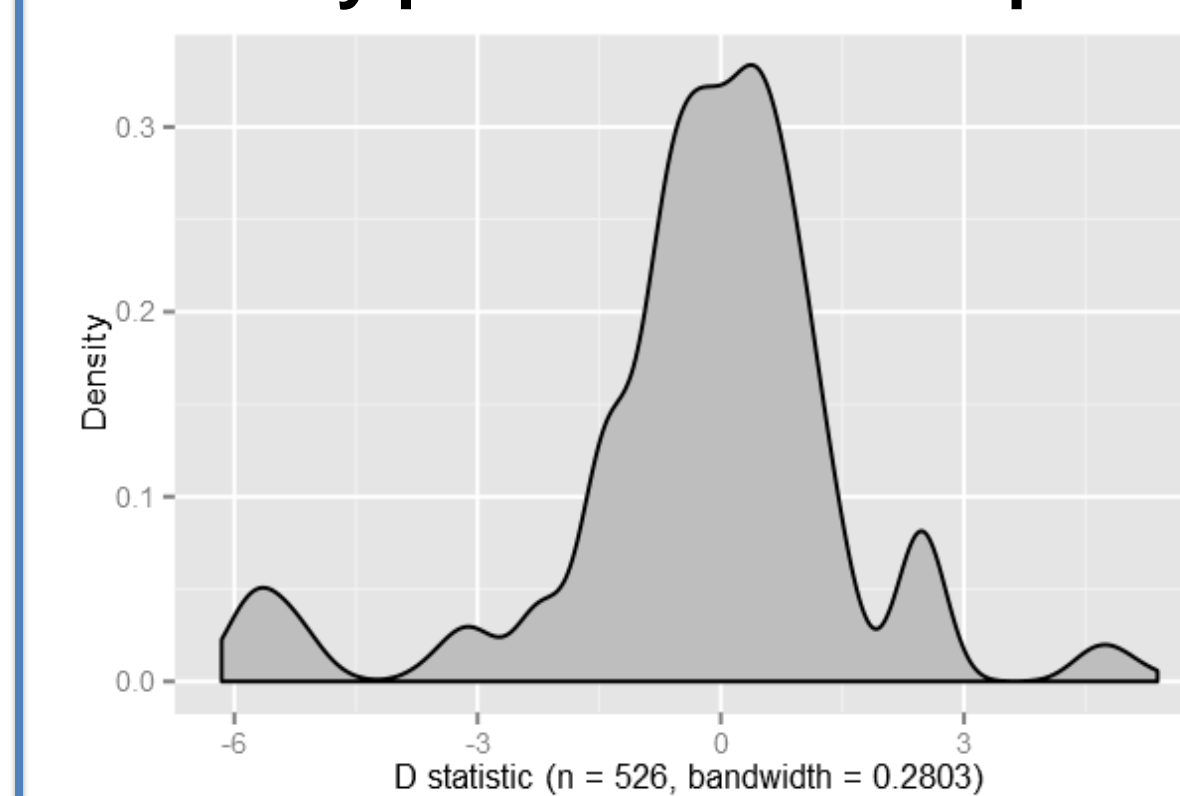
## Test 1: *D* statistic (binary data) – R package caper

**Density plot of *D* for Tai phonemes**



r	-1.32693	0.8592	0.0039
c	-1.22613	0.8612	0.0019
ph	-1.13276	0.861	0.0059
t	-0.73393	0.8379	0.0022
u	-0.72056	0.8483	0.002
w	-0.35617	0.6508	0.0406
u	-0.3087	0.6433	0.0375
...	...	...	...
o	0.986454	0.151	0.4283
ur	0.997876	0.1492	0.4253
b	1.087499	0.1805	0.4069
e	1.420117	0.2461	0.4974
d	1.495991	0.0934	0.6163
c	1.517884	0.042	0.7487
k	2.460614	0.2287	0.3501
o	2.474653	0.229	0.3529
δ	2.506732	0.2301	0.352
sh	4.94437	0	0.7052
<b>Mean D</b>	<b>-0.11911</b>		
<b>SD</b>	<b>1.98</b>		

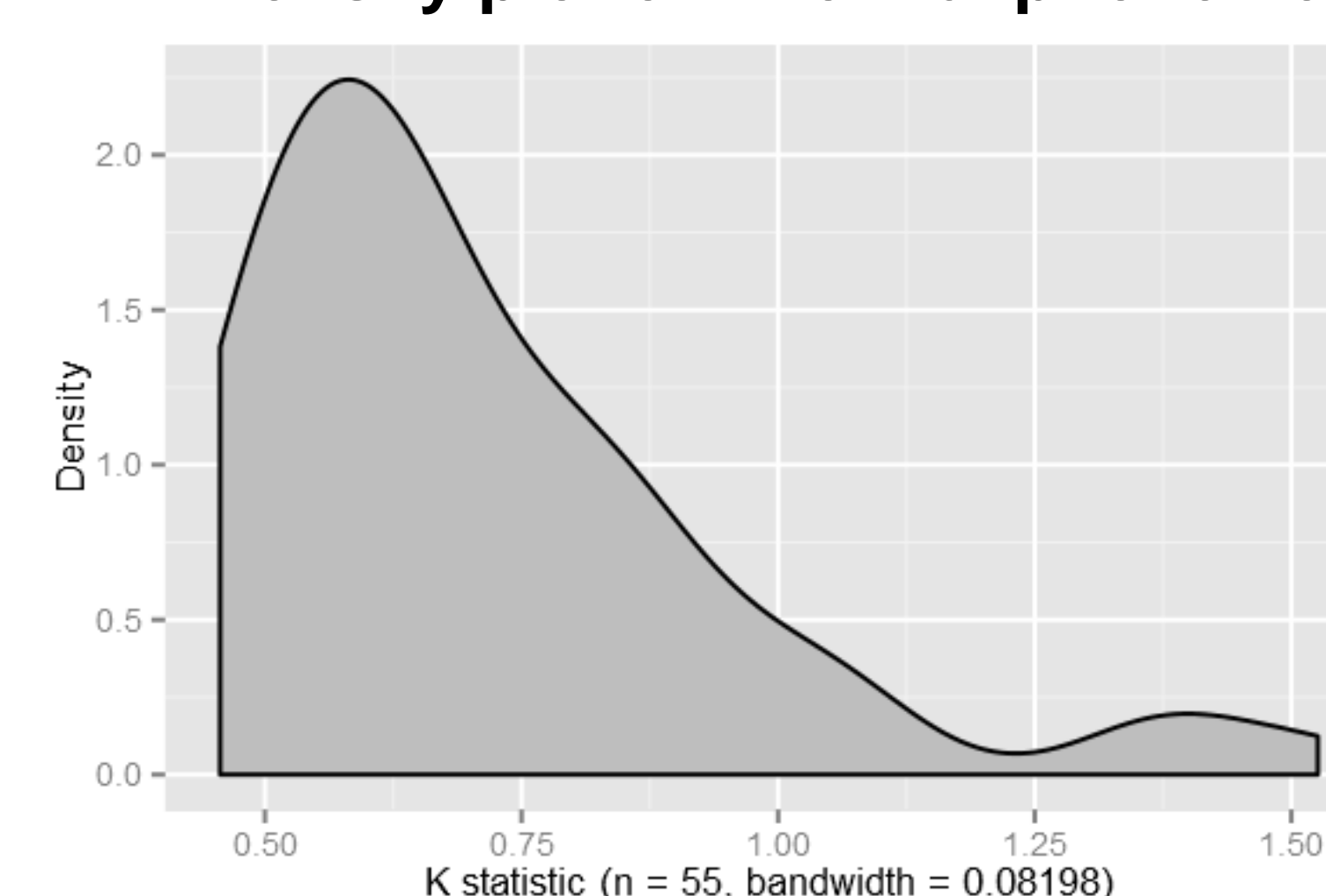
**Density plot of *D* for Tai biphones**



ä#	-5.67237	0.9479	0
yɔ	-5.65405	0.9467	0
ni	-5.63626	0.947	0
xe	-5.59447	0.9492	0.0068
a:l	-5.57923	0.8313	0
xo	-5.56562	0.9524	0.0074
xi	-5.54646	0.9491	0.0062
...	...	...	...
o?	4.46611	0	0.696
a?	4.55446	0	0.7024
ɣp	4.57207	0	0.6949
e?	4.63794	0	0.6944
#sh	4.67346	0	0.7015
shu	4.81471	0	0.6994
shɣ	4.87617	0	0.6996
shj	4.89928	0	0.7051
ɣ?	4.90521	0	0.7
br	4.93359	0	0.7016
<b>Mean D</b>	<b>-0.23937</b>		
<b>SD</b>	<b>1.86</b>		

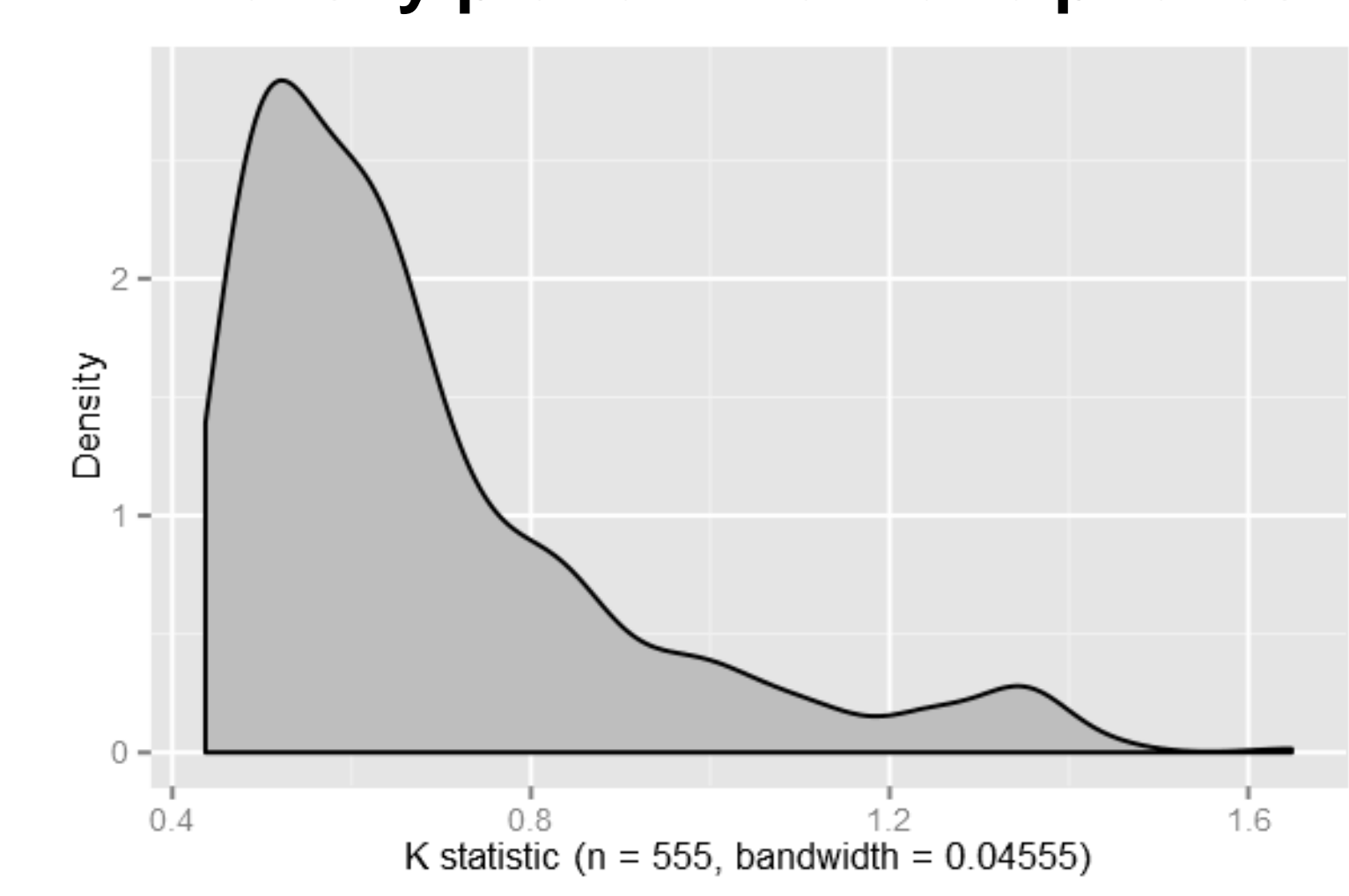
## Test 2: Blomberg's *K* (continuous data) – R package picante

**Density plot of *K* for Tai phonemes**



**Mean *K* for Tai phonemes:**  
**0.71**

**Density plot of *K* for Tai biphones**



**Mean *K* for Tai biphones:**  
**0.68**

## Conclusions

- This study finds strong phylogenetic signal in “course-grained” binary phonemic and biphoneme data, contra Macklin-Cordes and Round (2016); this can be attributed to the greater degree of variation in the phoneme systems of Tai languages than in Australian Aboriginal languages.
- This study also confirms the findings of Macklin-Cordes and Round (2016), which observed phylogenetic signal in “high-definition” phonotactic data in Australian aboriginal languages
- Additional tests of  $\delta$ -score (Holland et al. 2002) and mean *Q*-residual (Gray et al. 2010) also showed signal in the data
- Phonological data of these types shows promise for use in quantitative historical linguistic tasks

**Future directions**

- A better tree is sorely needed! New lexical phylogenetic tree of the Kra-Dai family in progress
- Testing other types of phonological data for Tai languages
  - e.g. historical tone splits and mergers, as derived from Gedney (1972) tone boxes (in progress)
- Once the new KD tree is ready, perform ancestral state reconstruction on phonological traits