

Exploring typological diversity and its areal and genealogical basis in South America

Emily Clem and Lev Michael
University of California, Berkeley

`eclem@berkeley.edu, levmichael@berkeley.edu`

Arealphonologie
5 July 2016

Introduction

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- How can we grasp large scale patterns in areal datasets?
- How can we identify areality?
- How can we identify typological tendencies?

Research questions

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- How is the phonological diversity of South America structured?
 - What are the major typological parameters of differentiation?
- What areal patterns are detectable?
- What genetic patterns do we find?
- What are the major types of phonological inventories and what are "extreme" languages?

A tool: PCA

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- One promising tool to identify large-scale patterns is PCA (principal component analysis)
- An advantage to PCA is that it does not rely on the analysts' presuppositions about the data
- This tool allows us to identify broad patterns in datasets in a less biased manner

Preview of results

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- We will present recurring evidence for a strong areal signal in the Andean and Circum-Andean region, separating it from Amazonia
- We will also show evidence for a smaller linguistic area in Northwest Amazonia
- We will argue that languages in South America differ as to whether the locus of phonological contrast is in their consonant system or vowel system
- We will demonstrate that contrasts in nasality and length on vowels are both significant dimensions of differentiation for inventories in South America

Roadmap

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
“types” in
South America

Conclusion

References

1 Introduction

2 Data and methods

3 Profiles of PCs 1 through 5

4 Phonological “types” in South America

5 Conclusion

The data: SAPHon

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- SAPHon (South American Phonological Inventory Database) is an online database of phonological inventories of languages of South America (Michael et al., 2016)
 - <http://linguistics.berkeley.edu/~saphon/en/>
- It contains phonological inventories for 363 languages
 - 56% of the total number of languages and dialects in South America identified on Glottolog (Hammarström et al., 2015)
 - 104 more than the number of languages with ISO codes in South America
- The data is compiled from published sources and unpublished field notes

Why SAPHon?

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- Why construct datasets like this?
 - It provides a systematic and comprehensive exploration of phenomena
 - It allows researchers to avoid cherry-picking
 - It provides a starting point for quantitative analysis to avoid eye-balling
- A really focused dataset like this would be useful to have for other regions of the world, and SAPHon is one model

A Question

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

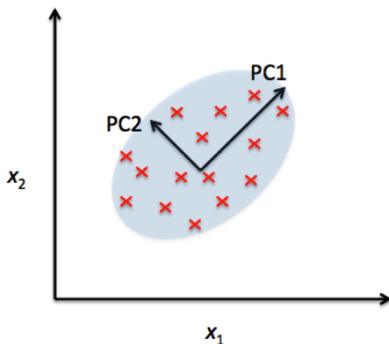
Conclusion

References

How does one identify and comprehend
patterns in large datasets?

The method: PCA

- PCA is a statistical method useful for dimension reduction
- It is a transformation of data along a new set of axes
- The axes along which there is the most variation in the data form the principal components (PC1, PC2, PC3...)



The method: PCA

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

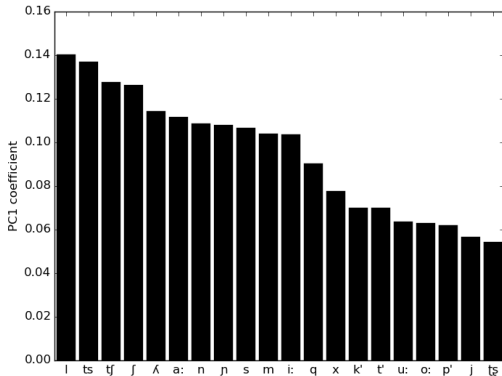
Conclusion

References

- PCA is a statistical method useful for dimension reduction
- It is a transformation of data along a new set of axes
- The axes along which there is the most variation in the data form the principal components (PC1, PC2, PC3...)
- By examining only the PCs that explain the largest amount of variance, we can reduce the number of dimensions in our dataset
 - We began with 301-dimensional dataset (the total number of unique phonemes in our data)
 - We will be examining the first 5 PCs, which account for over 35% of the variance in the data
- Because PCA is linguistically-naïve it does not pick out linguistic features as such but rather identifies segments which covary in their presence or absence in this dataset

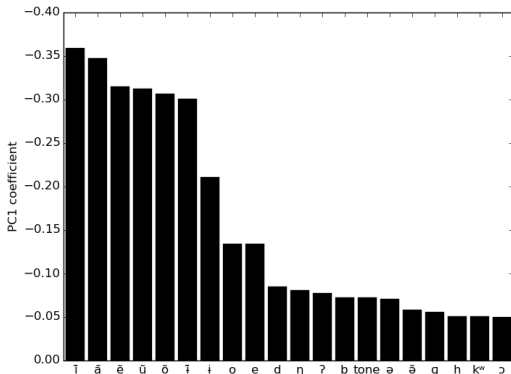
PC1: positive coefficients

- PC1 explains 14.2% of the variance in the data
- The segments with the largest positive coefficients include affricates, palatals, and laterals



PC1: negative coefficients

- The segments with the largest negative coefficients include nasal vowels, ɨ , and mid vowels



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC1: summary of coefficients

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

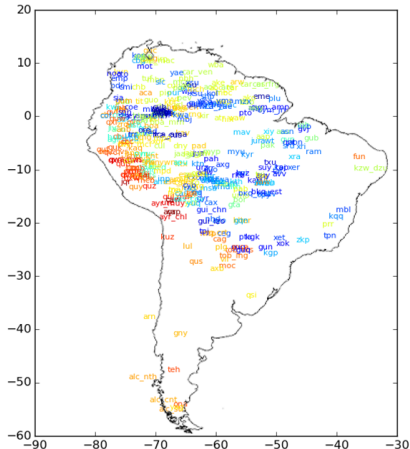
Conclusion

References

- Negative coefficients are slightly larger than positive coefficients
- Nasal vowels are the most strongly negative segments
- ɨ is also strongly negative
- Alveolar and palatal laterals, affricates, fricatives, and nasals are the most strongly positive segments
- The mid vowels e and o are moderately negative

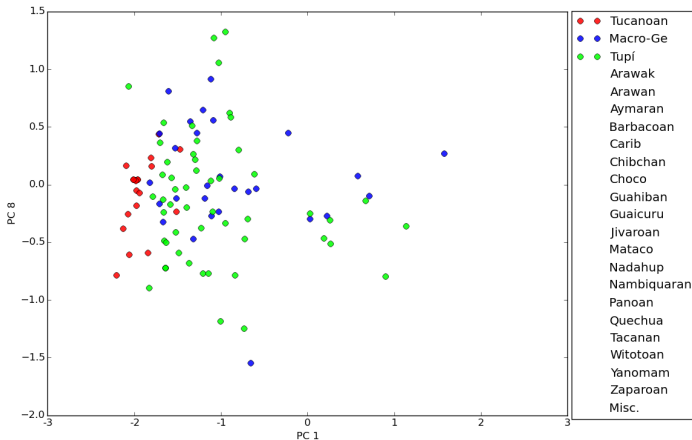
PC1: areal signal

- PC1 yields a strong positive signal in the Andean and Circum-Andean region (Michael et al., 2014)



PC1: genetic signal

- PC1 shows a negative genetic signal including the Tucanoan, Macro-Ge, and Tupí families



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

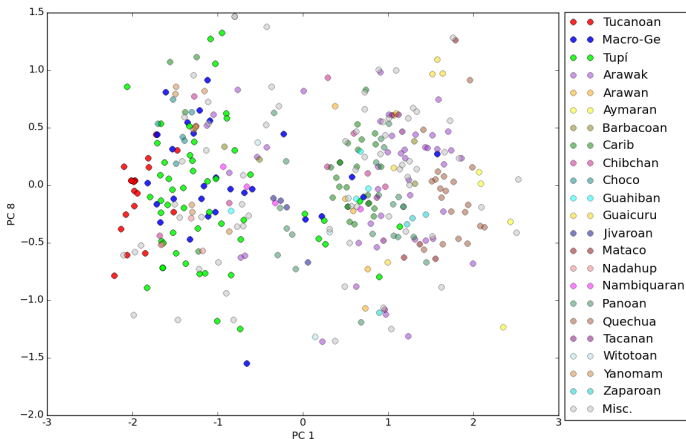
Phonological
"types" in
South America

Conclusion

References

PC1: genetic signal

- PC1 shows a negative genetic signal including the Tucanoan, Macro-Ge, and Tupí families



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC1: summary

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

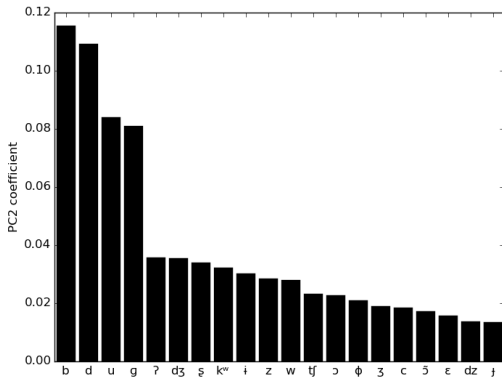
Conclusion

References

- Positive segments: alveolar and palatal laterals, affricates, fricatives, and nasals
- Negative segments: nasal vowels, ÷
- Positive component yields a strong areal signal in the Andes and Circum-Andean area, including Patagonia
- Negative component shows a genetic signal from Tucanoan, Macro-Ge, and Tupí

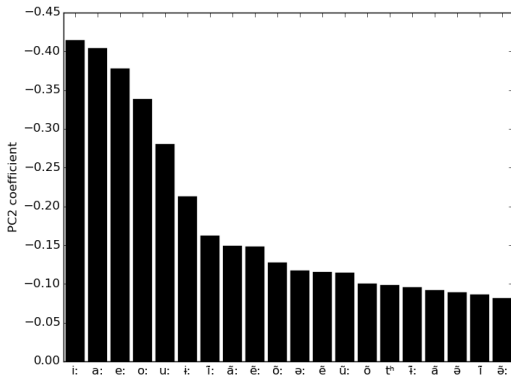
PC2: positive coefficients

- PC2 explains 7.6% of the variance in the data
- The segments with the largest positive coefficients include the voiced stops



PC2: negative coefficients

- All of the segments with the largest negative coefficients are long vowels



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC2: summary of coefficients

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

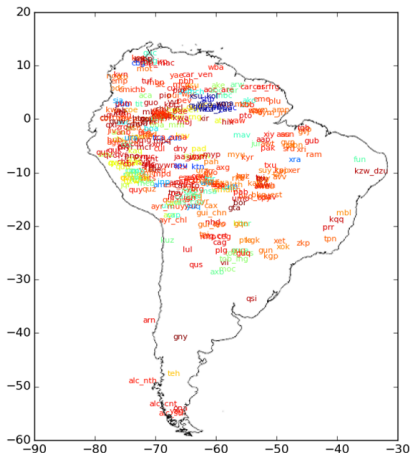
Conclusion

References

- Negative coefficients are larger than positive coefficients
- All strongly negative segments are long vowels
- The most strongly positive segments are voiced stops

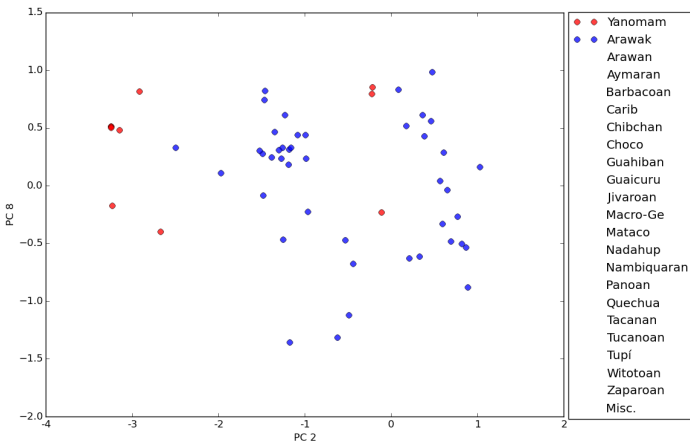
PC2: areal signal

- PC2 does not display a strong areal signal distinct from genetic relationships



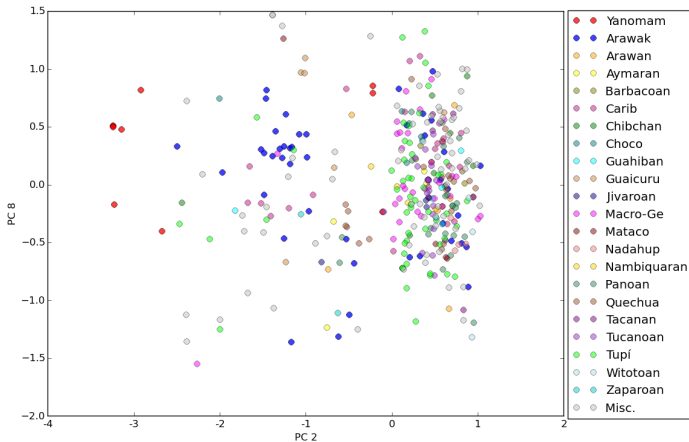
PC2: genetic signal

- PC2 shows a strongly negative genetic signal from the Yanomam family and a moderate signal from Arawak



PC2: genetic signal

- PC2 shows a strongly negative genetic signal from the Yanomam family and a moderate signal from Arawak



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC2: summary

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

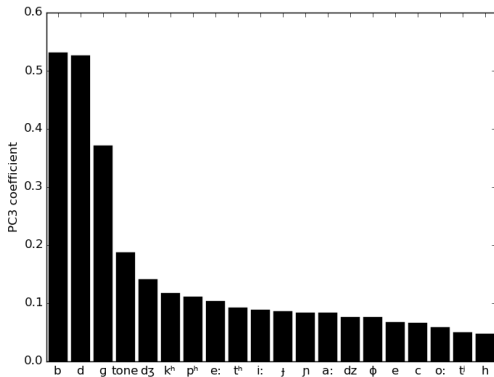
Conclusion

References

- Positive segments: voiced stops
- Negative segments: long vowels
- Negative component shows a strong genetic signal associated with Yanomam, and other families also cluster together
- We see a large negative dispersion with the most strongly negative languages displaying vowel length contrasts for many vowels

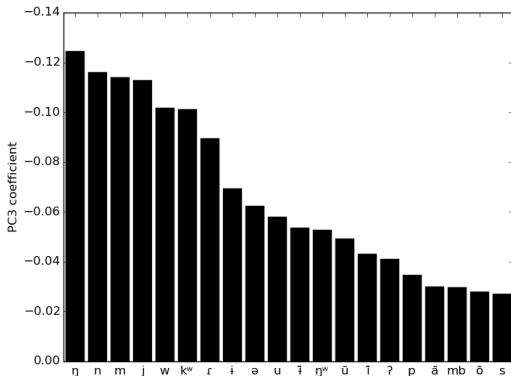
PC3: positive coefficients

- PC3 explains 5.4% of the variance in the data
- The segments with the largest positive coefficients include the voiced stops, tone, and aspirated stops



PC3: negative coefficients

- The segments with the largest negative coefficients include the nasal stops and approximants



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC3: summary of coefficients

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

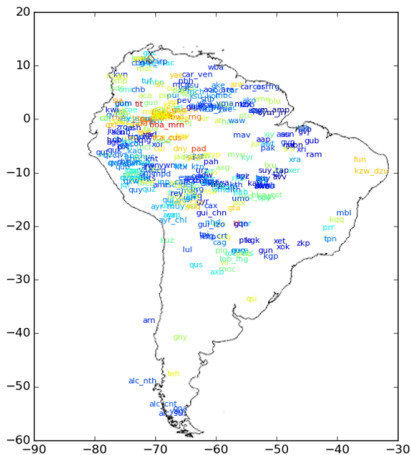
Conclusion

References

- Positive coefficients are much larger than negative coefficients
- The most strongly positive segments are voiced stops and aspirated stops
- Tone is strongly positive
- The most strongly negative segments are nasal stops
- Strongly positive languages are those which display nasal harmony

PC3: areal signal

- PC3 shows a strong positive signal in Northwest Amazonia



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

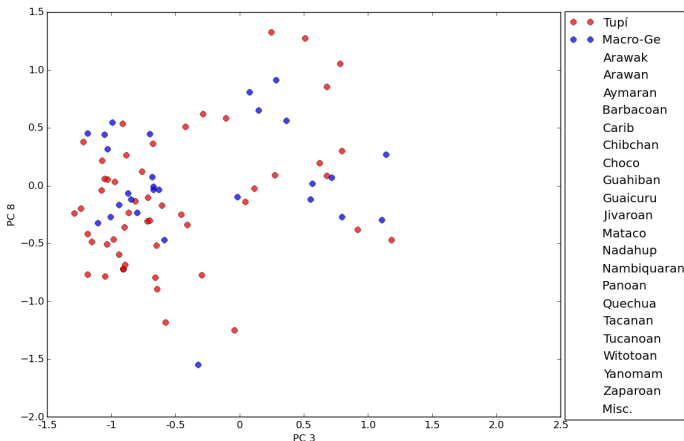
Phonological
"types" in
South America

Conclusion

References

PC3: genetic signal

- PC3 shows a strong negative genetic signal associated with the Tupí and Macro-Ge families



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

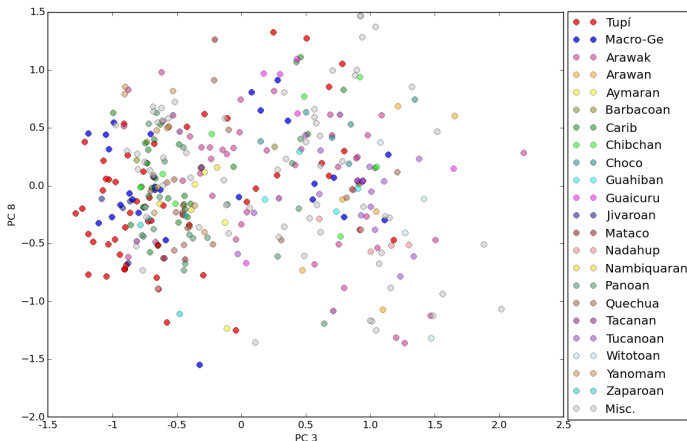
Phonological
"types" in
South America

Conclusion

References

PC3: genetic signal

- PC3 shows a strong negative genetic signal associated with the Tupí and Macro-Ge families



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC3: summary

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

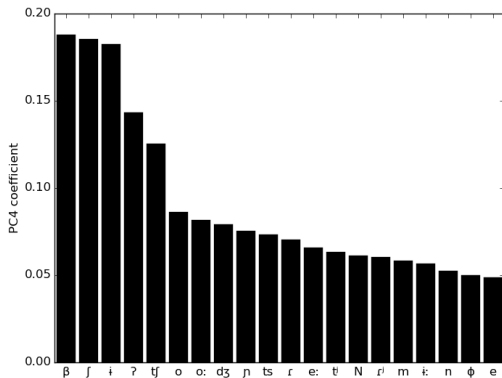
Conclusion

References

- Positive segments: voiced stops, tone
- Negative segments: nasal stops, approximants
- Positive component yields a strong areal signal in Northwest Amazonia
- This positive signal reflects languages that have processes of nasal harmony rather than underlying nasal stops
- Negative component shows a genetic signal from Tupí and Macro-Ge

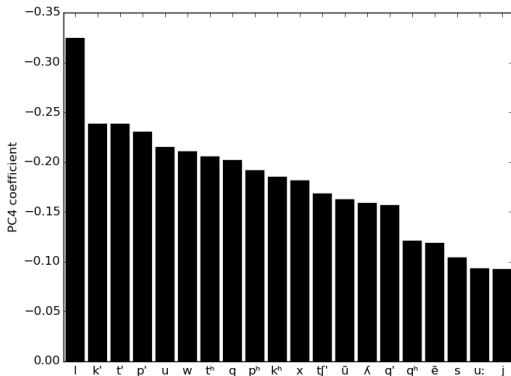
PC4: positive coefficients

- PC4 explains 4.6% of the variance in the data
- The segments with the largest positive coefficients include β , $\dot{\imath}$, palatals, and mid vowels



PC4: negative coefficients

- The segments with the largest negative coefficients are ejectives, aspirated stops, laterals, and uvulars



PC4: summary of coefficients

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

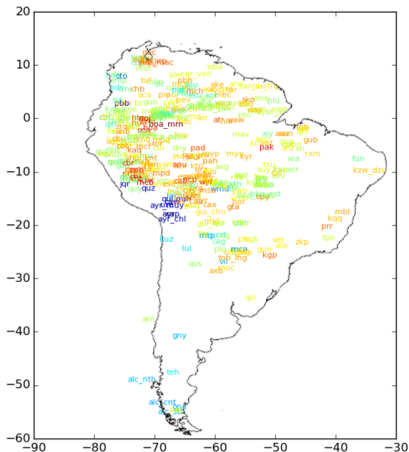
Conclusion

References

- Negative coefficients are larger than positive coefficients
- The lateral l is the most strongly negative segment
- Ejectives, aspirated stops, and uvulars are strongly negative
- β , $\dot{\imath}$, and palatals are the most strongly positive segments

PC4: areal signal

- PC4 shows a strong negative signal in the Southern Andean and Circum-Andean region, including Patagonia



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

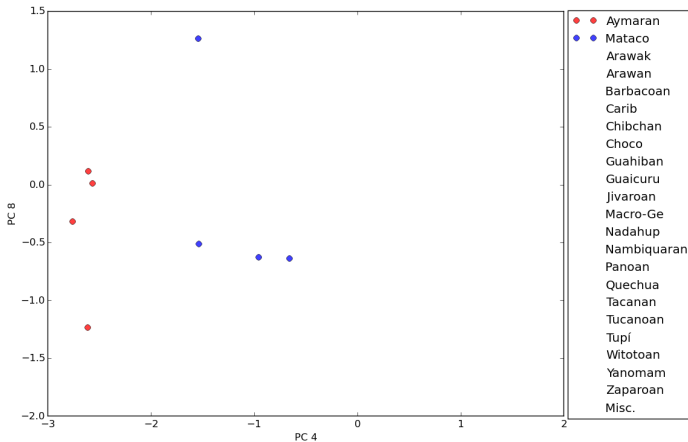
Phonological
"types" in
South America

Conclusion

References

PC4: genetic signal

- PC4 does not show a strong genetic signal distinct from an areal signal



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

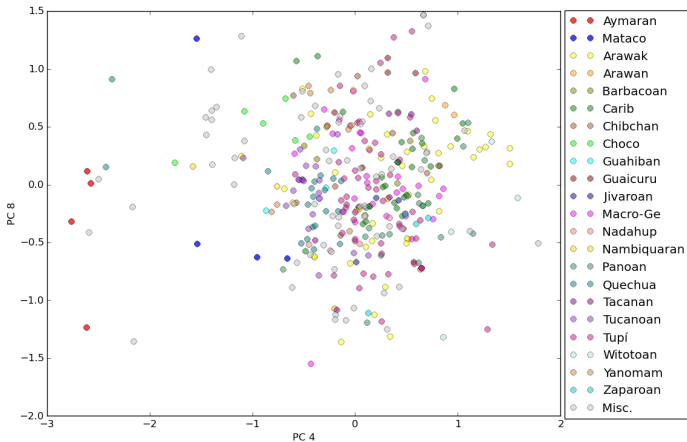
Phonological
"types" in
South America

Conclusion

References

PC4: genetic signal

- PC4 does not show a strong genetic signal distinct from an areal signal



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC4: summary

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

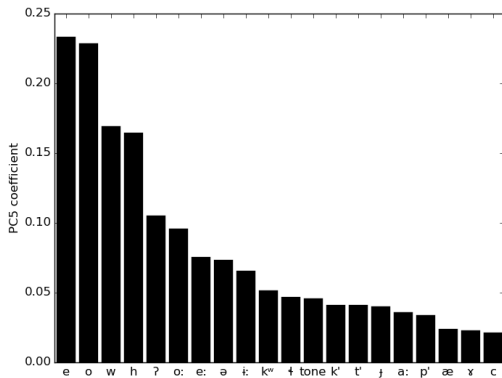
Conclusion

References

- Positive segments: β , $\ddot{\iota}$, palatals
- Negative segments: ejectives, aspirated stops, laterals, uvulars
- Negative component shows further support for a strong areal signal in Southern Andean and Circum-Andean region

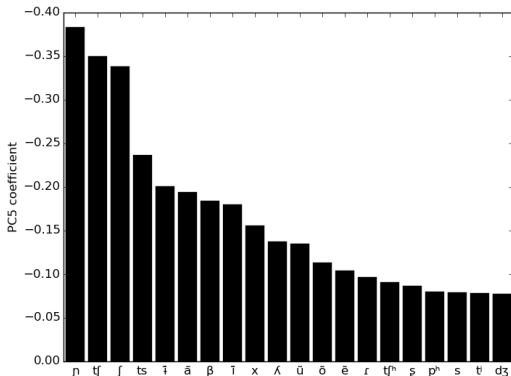
PC5: positive coefficients

- PC5 explains 3.9% of the variance in the data
- The segments with the largest positive coefficients are mid vowels, w, and glottals



PC5: negative coefficients

- The segments with the largest negative coefficients are palatals, affricates, and $\dot{\text{i}}$



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC5: summary of coefficients

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

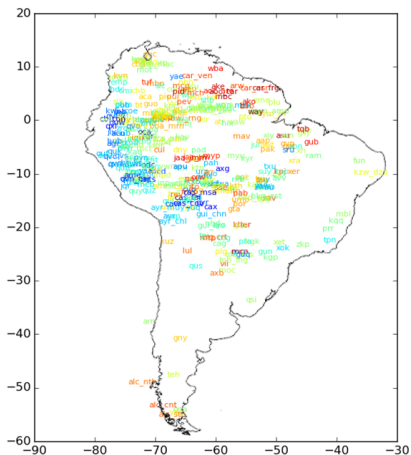
Conclusion

References

- Negative coefficients are slightly larger than positive coefficients
- Palatals and affricates are the most strongly negative segments
- Mid vowels are the most strongly positive segments
- $\dot{\text{ɨ}}$ is strongly negative

PC5: areal signal

- PC5 shows a negative signal in the Central-Northern Andean region and a positive signal in the east



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

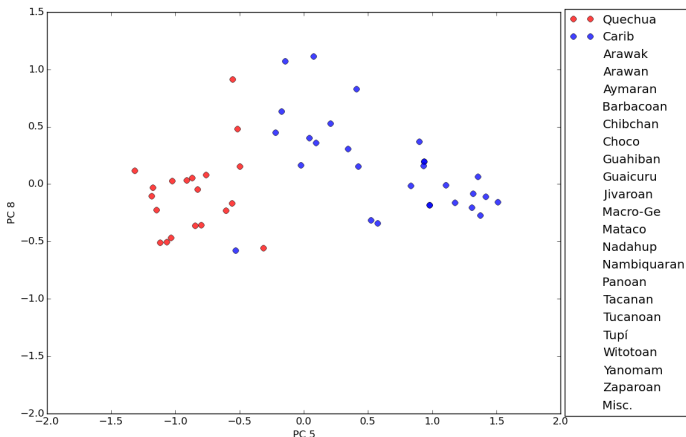
Phonological
"types" in
South America

Conclusion

References

PC5: genetic signal

- PC5 shows a west/east divide illustrated by the Quechua and Carib families and neighboring languages



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

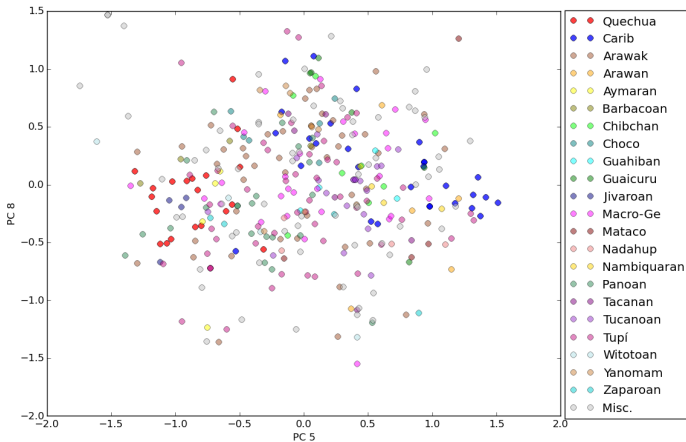
Phonological
"types" in
South America

Conclusion

References

PC5: genetic signal

- PC5 shows a west/east divide illustrated by the Quechua and Carib families and neighboring languages



Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

PC5: summary

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- Positive segments: mid vowels
- Negative segments: palatals, affricates, ð
- There is a general divide, both genetic and areal, between a negative signal in the west and a positive signal in the east
- Overall, the signal is becoming weak by this point

Identifying phonological “types”

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
“types” in
South America

Conclusion

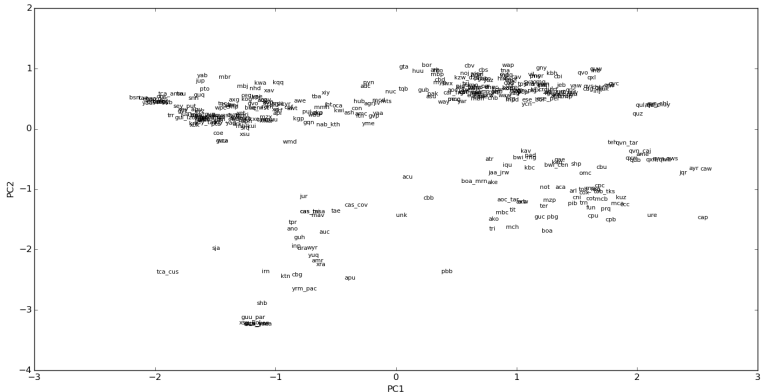
References

- Having identified the major dimensions of variation in South America, we can develop a “continental typology” of phonological inventories
- Major types can be identified by examining how inventories cluster with respect to PC1 and PC2
- Sampling languages in each cluster allows us to identify their major features

Phonological types in South America

Typological
Diversity in
South
America
Clem &
Michael

- What major types can we extrapolate from PCA?
- What are the clusters and what are their general profiles?



Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

Quadrant 1: +PC1, +PC2

- Features: large consonant inventories (laterals, affricates, voiced stops) and small vowel inventories
- Example language: Salasca Quechua (Quechua)

| Consonants | Bilabial | Alveolar | Post-alveolar | Palatal | Velar |
|-------------------|----------------|----------------|---------------|---------|----------------|
| Aspirated stop | p ^h | t ^h | | | k ^h |
| Plain/voiced stop | p b | t d | | | k g |
| Affricate | | ts | tʃ | | |
| Fricative | | s z | ʃ ʒ | | x |
| Nasal | m | n | | ɲ | |
| Approximant | | | | j | w |
| Tap, flap | | r | | | |
| Lateral | | l | | | |

| Vowels | Front | Central | Back |
|---------------|-------|---------|------|
| High | i | | u |
| Low | | a | |

Quadrant 2: +PC1, -PC2

- Features: large consonant inventories (laterals, affricates), moderate vowel inventories (long vowels)
- Example language: Chamicuro (Arawak)

| Consonants | Bilabial | Alveolar | Post-alveolar | Retroflex | Palatal | Velar | Glottal |
|-------------------|----------|----------|---------------|-----------|---------|-------|---------|
| Stop | p | t | | | | k | ʔ |
| Affricate | | ts | tʃ | tʂ | | | |
| Fricative | | s | ʃ | ʂ | | | h |
| Nasal | m | n | | | ɲ | | |
| Approximant | | | | | j | w | |
| Tap, flap | | ɾ | | | | | |
| Lateral | | l | | | ɭ | | |

| Vowels | Front | Central | Back |
|---------------|-------|---------|------|
| High | i i: | | u u: |
| Mid | e e: | | o o: |
| Low | | a a: | |

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

Quadrant 3: -PC1, -PC2

- Features: small consonant inventories, large vowel inventories (nasal and long vowels)
- Example language: Karitiâna (Tupí)

| Consonants | Bilabial | Alveolar | Palatal | Velar | Glottal |
|-------------------|----------|----------|---------|-------|---------|
| Stop | p | t | | k | |
| Fricative | | s | | | h |
| Nasal | m | n | ɲ | ŋ | |
| Approximant | | | | w | |
| Tap, flap | | ɾ | | | |

| Vowels | Front | Central | Back |
|---------------|-----------|-------------|-----------|
| High | i ĩ i: ĩ: | ɨ ɨ̃ ɨ: ɨ̃: | |
| Mid | e ě e: ě: | | o õ o: õ: |
| Low | | a ã a: ã: | |

Quadrant 4: -PC1, +PC2

- Features: moderate consonant inventories (voiced stops), moderate vowel inventories (nasal vowels)
- Example language: Siona (Tucanoan)

| Consonants | Bilabial | Alveolar | Post-alveolar | Palatal | Velar | Labio-velar | Glottal |
|-------------------|----------|----------|---------------|---------|-------|-------------------------------|---------|
| Stop/affricate | p b | t d | tʃ | | k g | k ^w g ^w | ʔ |
| Fricative | | s z | | | | h ^w | h |
| Nasal | m | n | | | | | |
| Approximant | | | | j | | w | |

| Vowels | Front | Central | Back |
|---------------|-------|---------|------|
| High | i ĩ | i ĩ | u ũ |
| Mid | e ě | | o õ |
| Low | | a ã | |

Phonological types, areality, and families

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- Many languages with a small number of vowel contrasts (Quadrant 1) comprise the linguistic area of the Circum-Andean region
- Some families cluster together within one of the predominant types
 - Yanomam is very tightly clustered in Quadrant 3

Conclusion

Typological
Diversity in
South
America

Clem &
Michael

Introduction

Data and
methods

Profiles of PCs
1 through 5

Phonological
"types" in
South America

Conclusion

References

- In South America, whether languages make a large number of contrasts in their vowels is very significant in “typing” languages
 - Nasal vs. oral is one of the most significant dimensions of variation
 - Length contrasts are also an important parameter of differentiation
- This continental profile of South America will look very different from the profiles of other continents
- This work provides a starting point for more quantitatively rigorous analyses of areality, such as NBC (naive Bayes classifier)

Hammarström, H., Forkel, R., Haspelmath, M., and Bank, S. (2015). Glottolog 2.4.

Michael, L., Chang, W., and Stark, T. (2014). Exploring phonological areality in the cirum-Andean region using a naive Bayes classifier. *Language Dynamics and Change*, 4(1):27–86.

Michael, L., Stark, T., Clem, E., and Chang, W. (2016). *South American Phonological Inventory Database*. University of California, Berkeley.