

# Using Environmental and Archaeological Samples to Build and Validate Strontium and Oxygen Isoscapes for Forensic Applications in the Peruvian Andes: Paths Forward for Identifying Victims from the Time of Violence in Peru (1980-1990s)



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## LEARNING OVERVIEW

### Isotopic Principles

- <sup>87</sup>Sr/<sup>86</sup>Sr varies with bedrock age and composition (Bentley, 2006); Sr replaces Ca in enamel hydroxyapatite, so <sup>87</sup>Sr/<sup>86</sup>Sr<sub>enamel</sub> reflects geological signature of childhood diet (and by proxy, place(s) of residence)
- Oxygen isotopes vary based on altitude, latitude, temperature, and distance from the coast (Bowen et al., 2005; Fry, 2006);  $\delta^{18}\text{O}$  values reflect geographically-specific drinking water consumed during tissue formation (Bowen et al., 2009; Ehleringer et al., 2008)
- Given local food and water consumption, enamel values beyond local baseline likely grew up outside the local isotopic catchment (Knudson, 2009; Knudson et al., 2016)
- Modeling "local" values from baseline materials is essential for geolocating individuals to likely geographic origins
- Isoscapes, geospatially explicit predictive models of isotope values, are used to geolocate skeletons to likely origins for O (Bowen et al., 2009; Chesson et al., 2018; Ehleringer et al., 2008; Ehleringer et al., 2010) and Sr systems (Laffoon et al., 2016; Laffoon et al., 2012). Prediction accuracy is improved by dual-isotope models (Laffoon et al. 2017)

### Forensic Context

- Long term aim: Create a multi-isotope isoscape of the Peruvian Andes to aid in identifying individuals killed in the Shining Path conflict in Peru in the 1980s-1990s
- ~69,000 individuals died in the conflict
- A few thousand bodies have been exhumed (Fig. 1)



Figure 1. Exhumations in Ayacucho, Peru

## HYPOTHESIS

Surface water isoscapes should yield predictions within the specified margin of error for strontium and oxygen isotopes.

## METHODS

### Isotope Analysis

- Water filtered, Sr separated through ion chromatography
- Archaeological enamel mechanically cleaned, drilled, and chemically prepared according to standard methods (e.g. Knudson et al. 2017; Tung et al. 2016)
- Elemental concentrations and <sup>87</sup>Sr/<sup>86</sup>Sr ratios analyzed Keck Lab (Knudson et al., 2017; Knudson et al., 2016; Marsteller et al., 2017)
- Water analyzed for  $\delta^{18}\text{O}$  at BSIRL (Tung et al., 2016)
- $\delta^{18}\text{O}_{\text{SMOW}} = ((^{18}\text{O}/^{16}\text{O})_{\text{sample}} / (^{18}\text{O}/^{16}\text{O})_{\text{standard}} - 1) \times 1000$  (Coplen, 1994; Craig, 1961)

### Geostatistical Models and Validation

- Universal kriging with first order trend removal used due to detection of east-west trend (to satisfy stationarity assumption); spherical model type
- Dual model was co-kriged
- 20% removed from the training datasets for validation
- Interval approach used to compare enamel measurements with single and dual isoscape predictions within error (see Laffoon et al., 2017)
- For Sr, acceptable error = measurement  $\pm$  2 SD
- For O, acceptable error = measurement  $\pm$  3.1‰, the "minimum meaningful difference" for  $\delta^{18}\text{O}$  in human enamel (Pestle et al. 2014)
- Standard model diagnostics reported (Oliver and Webster 2014)
- Validation from published and unpublished enamel

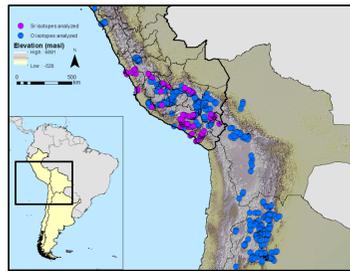


Figure 2. Surface water collection sites (N = 124 for Sr, N = 236 for O).

## RESULTS: STRONTIUM ISOSCAPE

- Surface water <sup>87</sup>Sr/<sup>86</sup>Sr values range: 0.70489 to 0.72267 (mean = 0.70766, sd = 0.0018, N = 124)
- Normally distributed (Ryan-Joiner p-value < 0.010)
- Best fit <sup>87</sup>Sr/<sup>86</sup>Sr model (Fig. 4, Fig. 5) diagnostics: Mean < 0.001; Root-mean-square = 0.0011; Mean standardized = 0.013; Root-mean-square standardized = 0.63; Average standard error = 0.003

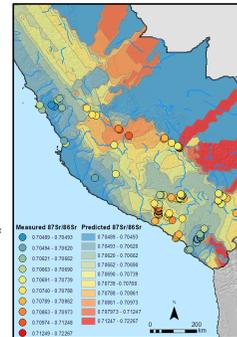


Figure 4. Water Sr isoscape.

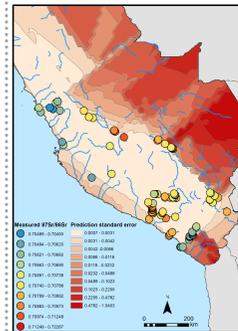


Figure 5. Prediction standard error for water Sr isoscape.

- Validation of 80% training model with 20% test set (water, n = 25) R<sup>2</sup> = 0.196
- Cross-validation with archaeological set (20% of published Andean <sup>87</sup>Sr/<sup>86</sup>Sr values from Scaffidi and Knudson ND, n = 202), R<sup>2</sup> = 0.229
- Interval approach validation: 95.0% of archaeological samples correctly classified within  $\pm$  2 SD (SD = 0.002, mean = 0.70766, n = 205)

## RESULTS: OXYGEN ISOSCAPE

- Surface water  $\delta^{18}\text{O}_{\text{SMOW}}$  values ranged from -19.6‰ to -3.5‰ (mean = -11.34, sd = 4.18, N = 575)
- Normally distributed (Ryan-Joiner p-value < 0.010)
- Best fit  $\delta^{18}\text{O}$  model (Fig. 6, Fig. 7) (See also Zimmer Dauphinee et al. 2020) diagnostics: Mean = -0.002; Root-mean-square = 1.168; Mean standardized = 0.003; Root-mean-square standardized = 1.054; Average standard error = 1.270

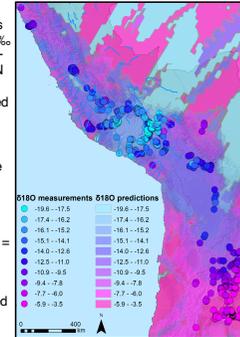


Figure 6. Water  $\delta^{18}\text{O}_{\text{SMOW}}$  isoscape.

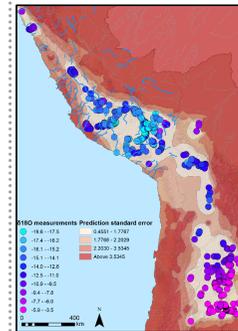


Figure 7. Prediction standard error for water  $\delta^{18}\text{O}_{\text{SMOW}}$  isoscape.

- Validation of 80% training model with 20% test set (water, n=115) R<sup>2</sup> = 0.973
- Cross-validation with archaeological set (20% of published Andean  $\delta^{18}\text{O}$  values compiled by Scaffidi and Tung, n = 115), R<sup>2</sup> = 0.027
- Interval approach validation: 92.9% of archaeological samples correctly classified within  $\pm$  3.1 (Pestle et al. 2014) (SD = 2.48, mean = -13.86, n = 115)

## RESULTS: DUAL ISOTOPE MODEL

- Co-kriged model: Same parameters as single models
- Cross-validation results are the same as reported for each individual isotope model
- Interval approach validation: 30 teeth from Uraca (Majes Valley, Peru) with paired <sup>87</sup>Sr/<sup>86</sup>Sr and  $\delta^{18}\text{O}$  data 87Sr/86Sr: 27/30 (90.0%) of predictions fell within the measured  $\pm$  2 SD (SD = 0.002, n = 30)
- $\delta^{18}\text{O}$ : 30/30 (100.0%) of predictions fell within the measured  $\pm$  3.1‰
- 27/30 (90.0%) of predictions at this site location met the criteria for both isotopes

## DISCUSSION & CONCLUSION

- Excellent fit at Uraca may be explained by mixed water at intermediate elevations (500 = 1000 masl); these models may perform more poorly at higher elevations where water sources are more heterogeneous
- Future validations should attempt to validate only with most probable locals
- Oxygen isotopes continue to perform worse than strontium
- Dual-isotope model more effective at constraining likely provenience than single-isotope models
- Ongoing work: Collecting baseline samples from regions poorly represented in database, generating process-based models, and generating probability maps of likely origins

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## REFERENCES AVAILABLE UPON REQUEST

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